

Quality Control Method and Performance Analysis of Temperature Data from the RPG_HATPRO_G4 Ground-Based Microwave Radiometer (Post-print)

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Abstract

For ground-based microwave radiometer temperature data at Longde Station, quality control experiments were conducted using five inspection methods—vertical variation intensity extreme check, standard deviation check, extreme value check, singular value check, and stuck value check—based on the inherent patterns of the data and various manifestations of erroneous data, combined with historical radiosonde data. The results were compared with concurrent radiosonde data to analyze the application effectiveness. The results indicate that each quality control method exhibits a certain ability to discriminate data quality and is sensitive to control parameters. Data quality is optimal under clear skies, followed by cloudy skies, and slightly poorer during precipitation, with essentially equivalent quality across all height levels. Correlation analysis of the quality control results demonstrates that correlations are highest under clear skies at all height levels, followed by cloudy skies, and slightly lower during precipitation, all remaining at relatively high levels; the quality control effect is most significant during precipitation.

Full Text

Quality Control Method and Efficiency Analysis on Temperature Data by RPG-HATPRO-G4 Type Ground-Based Microwave Radiometer

Abstract: Quality control of meteorological data is a crucial step in data processing. Since microwave radiation products constitute non-conventional meteorological observation data, conventional quality control methods are not fully

applicable to microwave radiometer data. To investigate quality control methods for temperature data from the RPG-HATPRO-G4 type ground-based multi-channel microwave radiometer and provide technical support for effective utilization of temperature data, this paper proposes five methods based on data characteristics and various error types. These methods are applied to temperature data collected by an RPG-HATPRO-G4 ground-based multi-channel microwave radiometer at Longde Station, Ningxia, China, combined with five-year historical sounding data from Pingliang Station, Gansu Province, located 49 km from Longde Station. The five methods include: extreme value check of vertical change intensity, standard deviation check of vertical change intensity, extreme value check, singular value check, and invariable value check. These are further combined into three categories: comprehensive check of vertical consistency, extreme value check, and comprehensive check of time consistency. Combination check and weighted check results are then obtained by synthesizing the three types of check results. Finally, to analyze the effectiveness of these methods, they are applied to the collected data and compared with concurrent sounding data. Results show that data quality under clear weather conditions is superior to that under cloudy and precipitation conditions, with cloudy weather data quality exceeding that of precipitation weather. For the three aforementioned weather conditions, high-quality data account for 97.86%, 97.83%, and 84.21% of total data, respectively. Data quality is essentially uniform across all layers, with poor-quality data primarily contributed by precipitation weather. Both combination check and weighted check demonstrate strong capability in assessing data quality, with respective quality control results being sensitive to corresponding control parameters. Correlation analysis of quality control results reveals the best correlation under clear weather at all altitudes, followed by cloudy weather, with precipitation weather showing the worst correlation; however, all correlation coefficients remain at high levels. The effect of data quality control is most pronounced under precipitation weather. This experiment demonstrates that the proposed data quality control scheme is feasible and provides a mechanism for distilling temperature data from the RPG-HATPRO-G4 type ground-based multi-channel microwave radiometer for other applications.

Keywords: ground-based microwave radiometer; temperature; sounding data; quality control

1 Data and Methods

1.1 Data Sources

The primary dataset consists of RPG-HATPRO-G4 temperature profile data observed at Longde Station (35.37°N, 106.07°E, altitude 2078 m) from June 10 to December 31, 2017 (excluding September 6-9 due to instrument maintenance). The temporal resolution is 1 minute, with vertical coverage from 0 to 10 km at 93 levels, and vertical resolution as shown in .

Vertical resolution of the RPG temperature profile (m)

Height Range	Resolution	Height Range	Resolution	Height Range	Resolution
0-10	10	500-1200	40	3500-4500	160
10-25	15	1200-1800	60	4500-6000	200
25-100	25	1800-2500	90	6000-9800	300
100-500	30	2500-3500	120	9800-10000	200

For comparative analysis, sounding data from Pingliang Station (35.55°N, 106.67°E, altitude 1468 m), located 49 km from Longde Station, are used. The sounding data cover June-December from 2013 to 2017 (08:00 and 20:00 UTC), with temporal resolution of 1 second and vertical resolution of 6-7 m. Temperature profiles from the microwave radiometer are interpolated to sounding levels for quality control assessment.

1.2 Quality Control Methods

Based on historical data characteristics and error types, five quality control methods are established: extreme value check of vertical change intensity, standard deviation check of vertical change intensity, extreme value check, singular value check, and invariable value check. These are combined into three comprehensive categories: comprehensive check of vertical consistency, extreme value check, and comprehensive check of time consistency. Quality control identifiers are assigned values of 0, 3, 6, and 9, representing “correct,” “suspect,” “error,” and “missing” data, respectively.

1.2.1 Extreme Value Check of Vertical Change Intensity For each temperature profile, maximum and minimum values of vertical change intensity (dT/dh) are calculated. Quality control identifier n is assigned based on whether dT/dh falls within $[dT_sh_min, dT_sh_max]$ or within expanded bounds using 3 and 6 thresholds (where σ represents the standard deviation), as detailed in .

Values of quality identifier n for extreme value check of vertical change intensity and corresponding meaning

dT_h Range	n Value	Meaning
$[dT_sh_min, dT_sh_max]$	0	Correct
$[dT_sh_min-3\sigma, dT_sh_min]$ $[dT_sh_max, dT_sh_max+3\sigma]$	3	Suspect

dT_h Range	n Value	Meaning
[dT_sh_min-6 , dT_sh_min-3] [dT_sh_max+3 , dT_sh_max+6] (-∞, dT_sh_min-6] [dT_sh_max+6 , +∞)	6 9	Error Missing

1.2.2 Standard Deviation Check of Vertical Change Intensity This method checks whether vertical change intensity at each level falls within 2, 3, or 4 bounds, where is the standard deviation of historical data. Quality identifier n is assigned accordingly, as shown in .

Values of quality identifier n for standard deviation check of vertical change intensity and corresponding meaning

dT_t Range	n Value
[dT_t ± 2]	0
[dT_t-3 , dT_t-2] [dT_t+2 , dT_t+3]	3
[dT_t-4 , dT_t-3] [dT_t+3 , dT_t+4]	6
(-∞, dT_t-4] [dT_t+4 , +∞)	9

1.2.3 Extreme Value Check Based on maximum (T_max) and minimum (T_min) temperature thresholds derived from historical data, quality identifier N is assigned according to . For the 93 levels below 10 km, T_max and T_min are determined from 2,139,065 historical samples.

Values of quality identifier N for comprehensive check of vertical consistency and corresponding meaning

Condition	N Value
n + n = 0	0
n + n = 3	3
n + n = 6	6
n + n = 9	9

1.2.4 Singular Value Check This method identifies temperature values that deviate significantly from historical ranges. Quality identifier N is assigned based on whether temperature falls within [T_min, T_max] or expanded bounds using 3t and 6t thresholds (where t represents the time variation parameter), as shown in .

Values of quality identifier N for extreme value check and corresponding meaning

T Range	N Value
$[T_{\min}, T_{\max}]$	0
$[T_{\min}-3t, T_{\min}]$ $[T_{\max}, T_{\max}+3t]$	3
$[T_{\min}-6t, T_{\min}-3t]$ $[T_{\max}+3t, T_{\max}+6t]$	6
$(-\infty, T_{\min}-6t]$ $[T_{\max}+6t, +\infty)$	9

1.2.5 Invariable Value Check This method checks for consecutive identical values over time. Quality identifier N is assigned based on the duration of invariable values, as detailed in .

Values of quality identifier N for comprehensive check of time consistency and corresponding meaning

Condition	N Value
$n + n = 0$	0
$n + n = 3$	3
$n + n = 6$	6
$n + n = 9$	9

1.3 Combination Check and Weighted Check

The three comprehensive check results (N_1, N_2, N_3) are synthesized through combination check and weighted check. For combination check, the final quality identifier N is calculated as the product: $N = N_1 \times N_2 \times N_3$, where $N = 0$ indicates correct data and $N > 0$ indicates suspicious or erroneous data. For weighted check, the final score F is calculated as the sum: $F = N_1 + N_2 + N_3$, where $F = 0$ represents the highest quality data, with increasing F values indicating decreasing quality.

2 Results and Analysis

2.1 Statistical Analysis of Quality Control Results

Applying the five quality control methods to the RPG-HATPRO-G4 temperature data yields the distribution of quality identifiers shown in . For data below 500 m, over 50% receive $N = N_1 = N_2 = N_3 = 0$ (highest quality). The weighted check method flags 84.21% of data as high quality ($F = 0$), demonstrating effective identification of problematic data.

Corresponding data number and frequency of weighted check result F ($N_1 + N_2 + N_3$) in different weather conditions

Weather Condition	F=0 (%)	F=3 (%)	F=6 (%)	F 9 (%)
Clear	811,859 (90.192)	56,846 (6.315)	4,409 (0.045)	17 (0.004)
Cloudy	436,926 (91.439)	14,930 (1.659)	698 (0.078)	3 (0.001)
Precipitation	301,201 (92.166)	14,076 (1.564)	94 (0.010)	1 (0.000)

2.3 Parameter Sensitivity Analysis

The standard deviation thresholds () for n and n checks significantly impact quality control results. Analysis shows that when Δ (the relative change in) ranges from -25% to +25%, the percentage of data flagged as high quality ($F = 0$) varies by less than 2.5%, indicating robust performance. However, when Δt exceeds thresholds, $n > 0$ and $n > 0$ increase substantially, leading to more data being flagged as suspicious.

2.4 Correlation Analysis with Sounding Data

Comparison with 9,679 concurrent sounding profiles reveals significant improvement in data quality after applying the quality control procedures. Before quality control, correlation coefficients between radiometer and sounding temperatures are 0.967 (clear), 0.934 (cloudy), and 0.880 (precipitation). After weighted check ($F = 0$), these improve to 0.992, 0.981, and 0.965, respectively, with the most pronounced improvement occurring in precipitation conditions [Figure 1: see original paper].

[Figure 1: see original paper] Variation of correlation coefficients (R) along with height before and after quality control of weighted check method (F) in different weather conditions

3 Conclusions

- (1) The five quality control methods effectively identify different types of errors in RPG-HATPRO-G4 temperature data. Data quality is highest under clear weather conditions, followed by cloudy weather, with precipitation weather producing the lowest quality data. High-quality data account for 97.86%, 97.83%, and 84.21% of observations under these three conditions, respectively.
- (2) Both combination check and weighted check demonstrate strong capability in assessing data quality, with results being sensitive to control parameters. The correlation analysis confirms that quality-controlled data show significantly improved agreement with sounding data, particularly in precipitation conditions where the quality control effect is most obvious.

- (3) The proposed quality control scheme is feasible and provides a robust mechanism for distilling reliable temperature data from the RPG-HATPRO-G4 ground-based microwave radiometer for meteorological applications.

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