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A simulation comparison of calibration functions for different sets of spectral filter passbands in the traditional pure rotational Raman lidar technique

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Abstract

The accuracy of tropospheric temperature measurements with pure rotational Raman (PRR) lidars is affected by the collisional broadening of N₂ and O₂ PRR lines. In this paper, we intercompare nine calibration functions (CFs) in the traditional PRR lidar technique via simulation. Taking into account the PRR line broadening, the simulation is performed for five sets of spectral filters (SFs) with different passbands in a PRR lidar receiving system. For simplicity of calculations, the transmission function of each SF is approximated by a rectangular function on the wavenumber interval, within which a SF passes the bulk of the backscattered signal intensity in the corresponding PRR lidar channel. A narrow-linewidth laser operating at wavelengths of 354.67 and 532 nm is considered as a lidar transmitter. The CF best suited for tropospheric temperature retrievals from raw PRR lidar data for each set of SFs and laser wavelength is determined by comparative analysis of calibration errors ΔT produced using these CFs. The absolute error $|\Delta T|$ does not exceed the value of 3×10^{-3} K when using the best three-coefficient CF, while $|\Delta T| < 4 \times 10^{-4}$ K for the best four-coefficient CF regardless of the laser wavelength and SF set used.

1 Introduction

In the pure rotational Raman (PRR) lidar technique, air temperature *T* is determined from a ratio Q(T) of backscattered signal intensities from two PRR spectrum bands of atmospheric molecules N₂ and O₂ [1–4]. For this reason, PRR lidars need to be calibrated and, therefore, a calibration function (CF) is required to retrieve temperature profiles from raw lidar signals. Several calibration methods aimed to improve temperature retrieval algorithms have been proposed in recent years [5, 6]. Behrendt et al. [7] made a correction for the elastic backscatter leakage into the nearest (to the laser line) PRR channel in the presence of cirrus clouds,

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whereas Su et al. [8] did the same for both PRR channels. Chen et al. [9] presented a novel method that provides accurate PRR lidar calibration under the low signal-to-noise ratio conditions. The corrections for the incomplete laser beam receiver-field-of-view overlap in the atmospheric boundary layer were proposed in [10–12]. The use of nonlinear CFs was shown in [13, 14] to increase the accuracy of temperature retrievals, especially in the troposphere where N₂ and O₂ PRR lines are significantly broadened by molecular collisions [15–17].

Two new techniques allowing retrieving temperature without lidar calibration have also been recently proposed and deserve attention. Weng et al. [18] designed a single-line-extracted PRR lidar system that effectively detects two isolated N_2 PRR line signals together with the elastic back-scatter signal. The system provides continuous temperature measurements without lidar calibration with external temperature measurement instruments (e.g., radiosondes). Mahagammulla Gamage et al. [19] reported on application of the Optimal Estimation Method (OEM) to retrieve temperature profiles along with instrumental (lidar) parameters from PRR lidar measurements. The PRR lidar technique that utilizes a reference temperature profile from an atmosphere model or radiosonde data for lidar calibration (determination of CF coefficients) is now called "traditional" one [19].

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Both techniques [18, 19] have several advantages over the traditional PRR lidar one. For example, the OEM is computationally fast and practical for routine temperature retrievals. The same is valid for the single-line-extracted PRR lidar. However, the selection of the lidar system or retrieval method depends on the problem to solve. In some cases the traditional retrieval algorithm showed some advantages over the considered techniques. Analyzing the results presented in [18], one can see that the traditional algorithm more precisely retrieves temperatures from nighttime measurements and in the presence of cirrus clouds, whereas the OEM more precisely retrieves temperatures from daytime measurements and in the presence of low level clouds. Both $1 - \sigma$ absolute statistical uncertainty of temperature retrieval and difference between retrieved and radiosonde profiles presented in [19] are much larger compared to those that can be provided by the traditional retrieval algorithm. Moreover, the accuracy of temperature retrievals with the traditional algorithm can always be increased by selecting a suitable CF [17].

The influence of passband widths of interference filters and their central wavelength positions in N₂ and O₂ PRR spectrum on the accuracy of temperature measurements using PRR lidars was analyzed in detail by Hammann and Behrendt [20]. However, the authors did not consider the PRR line broadening in their simulation. Conversely, the collisional broadening of N2 and O2 PRR lines was taken into account in [17], but only for one set of spectral filter (SF) passbands in a PRR lidar receiving system. In this study, we estimate the effect of collisional PRR line broadening on the accuracy of tropospheric (0-11 km) temperature measurements and intercompare nine nonlinear CFs in the traditional PRR lidar technique via simulation. The simulation is performed for five frequently used sets of SF passband widths and two laser wavelengths (354.67 and 532 nm). Note that the design features of PRR lidars are not taken into account in this study.

2 Calibration functions

2.1 General calibration function

According to the PRR lidar theory [1, 2, 4], a simple temperature dependence can be obtained only for the intensity ratio of any two individual PRR lines *i* and *k* from N_2 and/ or O_2 PRR spectrum:

$$Q^{\text{indiv.}}(T) = \frac{I(J_i, T)}{I(J_k, T)} = \exp\left(\alpha + \frac{\beta}{T}\right).$$
(1)

Here, J_i and J_k are the rotational quantum numbers of the initial states of the PRR transitions corresponding to lines *i*

and *k*, and α and β are the constants defined from the theory. Taking the natural logarithm of Eq. (1), we have:

$$\ln Q^{\text{indiv.}}(T) = \alpha + \frac{\beta}{T} \quad \Leftrightarrow \quad y = \alpha + \beta x, \tag{2}$$

where x = 1/T is the reciprocal temperature and $y = \ln Q^{\text{indiv}}(T)$. The desired temperature is easily derived from the ratio of intensities:

$$T = \frac{\beta}{\ln Q^{\text{indiv.}} - \alpha}.$$
(3)

In practical measurements, SFs in PRR channels of a lidar receiving system extract two bands from the backscattered light spectrum [4]. Both bands, containing several adjacent lines from the Stokes and/or anti-Stokes branches of N2 and O₂ PRR spectrum, are selected so that the intensities of the lines entering them have the opposite temperature dependence (Fig. 1). The lines, corresponding to low (J_{low}) and high (J_{high}) rotational quantum numbers of the initial states of the PRR transitions, fall into the near and far (to the laser line) PRR channels (channels J_{low} and J_{high}), respectively. The intensity of each N₂ PRR line with $J_{low} \le 8$ ($J_{low} \le 11$ for O₂ PRR lines) decreases with increasing temperature and, conversely, the intensity of N₂ PRR lines with $J_{\text{high}} \ge$ 9 ($J_{\text{high}} \ge 13$ for O₂ PRR lines) increases with increasing temperature, in both branches of the spectrum. The choice of such lines makes it possible to minimize the overlap of the



Fig. 1 Equidistant PRR spectra of N_2 and O_2 linear molecules, schematic drawing of filter transmission functions (FTF), and envelopes of N_2 PRR spectrum at different temperatures. The laser beam wavelengths are 354.67 and 532 nm. The index over a spectral line denotes the rotational quantum number *J* of the initial state of the transition. All PRR line intensities are normalized to the intensity of N_2 PRR line with *J*=6 of the anti-Stokes branch at *T*=220 K

SF transmission functions of PRR channels (Fig. 1). Note that only odd lines beginning with odd J exist in O₂ PRR spectrum [21]. Therefore, we have to consider the following ratio [2]:

$$Q^{\Sigma}(T) = \frac{I_{\text{low}}^{\Sigma}(T)}{I_{\text{high}}^{\Sigma}(T)} = \frac{\left[\sum_{J_i} \sum_{i=N_2,O_2} I_i(J_i, T)\right]_{\text{low}}}{\left[\sum_{J_i} \sum_{i=N_2,O_2} I_i(J_i, T)\right]_{\text{high}}},$$
(4)

where $I_i(J_i, T)$ are the intensities of N₂ and O₂ individual PRR lines, corresponding to rotational quantum numbers J_i , $I_{low}^{\Sigma}(T)$ and $I_{high}^{\Sigma}(T)$ are the overall intensities of the PRR lines that enter the corresponding channels J_{low} and J_{high} , indices "low" and "high" show that summations in the numerator and denominator refer to the corresponding PRR spectrum bands.

The right side of Eq. (4) represents the ratio of the sums of exponential expressions that cannot be reduced to a simple function of temperature and, therefore, the intensity ratio $Q^{\Sigma}(T)$ needs to be calibrated. Arshinov et al. [2] proposed the simplest (linear) CF in the form of Eq. (2) and, hence, the air temperature is determined from the ratio $Q^{\Sigma}(T)$ similarly to Eq. (3):

$$T = \frac{B_0}{\ln Q^{\Sigma} - A_0},\tag{5}$$

where A_0 μB_0 are the calibration (fit) coefficients. To reduce the statistical uncertainties of temperature retrievals, the second-order polynomial was proposed in [13] to be used as a CF:

$$\ln Q^{\Sigma} = A_1 + \frac{B_1}{T} + \frac{C_1}{T^2} \quad \Leftrightarrow \quad y = A_1 + B_1 x + C_1 x^2, \quad (6)$$

where A_1 , B_1 and C_1 are the calibration coefficients. The other types of CFs have been used for temperature retrievals in [3, 4, 14–17].

Equations (1)–(6) were obtained under the assumption that PRR lines are not broadened and, therefore, their profiles are described by the Dirac function. In fact, PRR lines are broadened due to both Doppler and molecular collision effects. PRR lines broadened only by the Doppler effect have a Gaussian profile, whereas the lines broadened only due to molecular collisions have a Lorentzian profile. The real PRR line profiles are described by a Voigt function that takes into account both types of broadening [22]. The molecular collision effect dominates over the Doppler one in the troposphere (Fig. 2) and the Lorentzian profile wings are higher than those of the Gaussian profile of the same full width at half maximum (FWHM) [22].

Owing to the long Lorentzian tails, each broadened PRR line j lying outside the SF passbands leads to the parasitic signal leakage into both PRR channels (Fig. 3). At the same



Fig. 2 FWHMs of the Gaussian, Lorentzian, and Voigt profiles of N_2 PRR line (with J=6 of the anti-Stokes branch) for the laser wavelengths of 354.67 and 532 nm. The dependence of temperature on altitude is set by the tropospheric (0–11 km) temperature profile of the U.S. Standard Atmosphere (1976)



Fig. 3 A schematic drawing (not to scale) of Voigt profiles of broadened PRR lines *i*, *j*, *k* and filter transmission functions (see Sect. 3.1) $F_{\text{low}}(\tilde{v})$ and $F_{\text{high}}(\tilde{v})$ of lidar channels J_{low} and J_{high} approximated by a rectangle function F = 1. The wavenumber \tilde{v}_0 and intervals $(\tilde{v}_1; \tilde{v}_2)$ and $(\tilde{v}_3; \tilde{v}_4)$ correspond to the laser line and passbands of channels J_{low} and J_{high} , respectively

time, the collisional broadening of any PRR lines *i* and *k* lying inside lidar channels J_{low} and J_{high} , respectively, results in both parasitic signal leakage into neighboring PRR channel and desired signal loss in both channels. The PRR lidar CF that takes into account the collisional broadening of all PRR lines was derived in the general analytical form in [15]:

$$\ln Q(T) = \sum_{n=-\infty}^{\infty} \alpha_n T^{\frac{n}{2}},\tag{7}$$

where α_n are the calibration coefficients.

2.2 Temperature retrieval functions

To obtain temperature profiles from raw lidar signals, a temperature retrieval function (TRF) T = T(O) derived from the selected CF Q = Q(T) is required in the traditional retrieval algorithm. In the case of the linear (2) and quadratic (6) CFs, the corresponding TRFs are easily derived. When choosing the third-order polynomial in 1/T as a CF, it is necessary to solve a cubic equation, the presence and number of real roots of which depend on the signs of the polynomial coefficients. Hence, any CF requiring solving a *n*-order equation (n > 3) to derive the corresponding TRF can hardly be used for temperature retrieval. As seen from Eq. (7), the general CF is a series and cannot be directly used in the temperature retrieval algorithm. For this reason, nine nonlinear CFs representing simple special cases of Eq. (7) were considered in [17]. All the special cases take the collisional broadening of N2 and O2 PRR lines into account in varying degrees. Below we give only the TRFs required for this study without specifying their initial nonlinear CFs. Since the linear CF completely ignores PRR line broadenings and its corresponding TRF retrieves temperature with larger errors (uncertainties) compared to other TRFs derived from nonlinear CFs [4, 15-17], we will not consider Eqs. (2) and (5). Each TRF *i* and its calibration constants A_i , B_i , C_i , etc. are numbered (i=1, 2, ..., 9) as in [17].

Let us consider three-coefficient TRFs, the first of which (TFR 1) is derived from the CF (6) proposed in [13]:

$$T = \frac{2C_1}{-B_1 + \sqrt{B_1^2 + 4C_1(\ln Q - A_1)}}.$$
(8)

TRF 2 corresponds to a CF proposed in [15]:

$$T = \frac{2B_2}{(\ln Q - A_2) + \sqrt{(\ln Q - A_2)^2 - 4B_2C_2}}.$$
(9)

TRF 3 was first applied in [14]:

$$T = \frac{C_3}{(\ln Q)^2 + B_3 \ln Q + A_3}.$$
 (10)

TRF 4 is derived from a CF proposed in [15]:

$$T = \frac{\ln Q}{B_4 (\ln Q)^2 + A_4 \ln Q + C_4}.$$
 (11)

The following two functions (TRFs 5 and 6) with three calibration constants were first used in [17]:

$$T = \left[\frac{2C_5}{-B_5 + \sqrt{B_5^2 + 4C_5(\ln Q - A_5)}}\right]^2,$$
 (12)

$$T = \left[\frac{2B_6}{(\ln Q - A_6) + \sqrt{(\ln Q - A_6)^2 - 4B_6C_6}}\right]^2.$$
 (13)

TRFs 7, 8, and 9 with four calibration constants were also first proposed and used in [17]:

$$T = \frac{D_7}{(\ln Q)^3 + C_7 (\ln Q)^2 + B_7 \ln Q + A_7},$$
(14)

$$T = \frac{(\ln Q)^2}{B_8 (\ln Q)^3 + A_8 (\ln Q)^2 + C_8 \ln Q + D_8},$$
(15)

$$T = \frac{\ln Q}{C_9 (\ln Q)^3 + B_9 (\ln Q)^2 + A_9 \ln Q + D_9}.$$
 (16)

The CFs which are initial for TRFs 1–9 along with the equations for the absolute and relative statistical uncertainties of temperature retrievals can be found in [17] and in the electronic supplementary material (Table S1).

3 Numerical simulation technique

In the next three Sects. 3.1–3.3, we make some assumptions to simplify the numerical calculation of the intensity ratio Q = Q(T).

3.1 Spectral filter transmission functions

Let us consider only the anti-Stokes branch of N_2 and O_2 PRR spectrum for definiteness. Due to the broadening of PRR lines and their contribution to the signals detected in both lidar channels, we can write [15] for the intensity ratio instead of Eq. (4):

$$Q^{\text{all}}(T) = \frac{I_{\text{low}}^{\text{all}}(T)}{I_{\text{high}}^{\text{all}}(T)} = \frac{\sum_{J_i} \sum_{i=N_2,O_2} \left[I_i(J_i, T) \cdot X_{\text{low}}^i(\widetilde{v}_i, T) \right]}{\sum_{J_i} \sum_{i=N_2,O_2} \left[I_i(J_i, T) \cdot X_{\text{high}}^i(\widetilde{v}_i, T) \right]}.$$
 (17)

Here, the summations are carried out over all rotational quantum numbers J_i of the initial states of N₂ and O₂ PRR transitions, $\tilde{v}_i = \tilde{v}(J_i)$ and $I_i(J_i, T)$ are the central wavenumber and total intensity of *i* broadened PRR line with J_i , respectively. The functions X_{low}^i and X_{high}^i describe the fractions of the intensity $I_i(J_i, T)$ that fall within the SF passbands of channels J_{low} and J_{high} , respectively, and $I_{low}^{all}(T)$ and $I_{high}^{all}(T)$ are the overall intensities detected in the corresponding lidar channels (with contributions from all broadened

lines). The functions X_{low}^i and X_{high}^i are defined by the following expressions:

$$X_{\text{low}}^{i}(\widetilde{\nu}_{i},T) = \int_{0}^{+\infty} F_{\text{low}}(\widetilde{\nu}) \cdot V(\widetilde{\nu}_{i},\widetilde{\nu},T) d\widetilde{\nu}, \qquad (18)$$

$$X_{\text{high}}^{i}(\widetilde{\nu}_{i},T) = \int_{0}^{+\infty} F_{\text{high}}(\widetilde{\nu}) \cdot V(\widetilde{\nu}_{i},\widetilde{\nu},T) d\widetilde{\nu}, \qquad (19)$$

where $F_{\text{low}}(\widetilde{\nu})$ and $F_{\text{high}}(\widetilde{\nu})$ are the SF transmission functions of channels J_{low} and J_{high} , respectively, and $V(\widetilde{\nu}_i, \widetilde{\nu}, T)$ is the Voigt profile of *i* broadened PRR line (Fig. 3).

There are several ways to approximate SF transmission functions by an analytical expression. For example, $F_{low}(\tilde{v})$ and $F_{high}(\tilde{v})$ are approximated by a Gaussian function [3] or by the function proposed in [23]. However, this complicates the calculation of integrals (18) and (19) and, therefore, ratio (17). As shown in [15], the SF transmission functions can be approximated by a piecewise-constant (staircase) function with any desired accuracy. To further simplify the calculations, the staircase function can be replaced by a constant one on the wavenumber interval, within which a SF passes the bulk of the backscattered signal intensity in the corresponding PRR channel (Fig. 3). For example, in the case of channel J_{low} we can write:

$$F_{\text{low}}(\widetilde{\nu}) = \begin{cases} 0, & \widetilde{\nu} \le \widetilde{\nu}_1 \\ F = \text{const}, & \widetilde{\nu} \in (\widetilde{\nu}_1; \widetilde{\nu}_2), \\ 0, & \widetilde{\nu} \ge \widetilde{\nu}_2 \end{cases}$$
(20)

where $(\tilde{v}_1; \tilde{v}_2)$ is the SF passband of the lidar channel. Without loss of generality, we can also put F = 1 for both SF transmission functions, and then instead of Eqs. (18) and (19) we get:

$$X_{\text{low}}^{i}(\widetilde{\nu}_{i},T) = \int_{\widetilde{\nu}_{1}}^{\widetilde{\nu}_{2}} V(\widetilde{\nu}_{i},\widetilde{\nu},T) \mathrm{d}\widetilde{\nu}, \qquad (21)$$

$$X_{\text{high}}^{i}(\widetilde{v}_{i},T) = \int_{\widetilde{v}_{3}}^{\widetilde{v}_{4}} V(\widetilde{v}_{i},\widetilde{v},T) \mathrm{d}\widetilde{v}, \qquad (22)$$

where $(\tilde{v}_3; \tilde{v}_4)$ is the SF passband of channel J_{high} . Note that one can choose to use the FWHMs of the SF transmission functions as the SF passbands $(\tilde{v}_1; \tilde{v}_2)$ and $(\tilde{v}_3; \tilde{v}_4)$.

3.2 PRR line profiles

The backscatter profile of *i* PRR line inhomogeneously broadened only due to the Doppler effect is known to be described by a Gaussian function (normal distribution) [22]:

$$G(\widetilde{\nu}_i, \widetilde{\nu}, T) = \frac{1}{\gamma_G^i \sqrt{2\pi}} \exp\left[-\frac{(\widetilde{\nu} - \mu_i)^2}{2(\gamma_G^i)^2}\right].$$
 (23)

Here, $\mu_i = \tilde{v}_i (\text{cm}^{-1})$ is the mathematical expectation (the central wavenumber of the line profile), and $\gamma_G^i (\text{cm}^{-1})$ is the standard deviation defined by the equation:

$$\gamma_G^i = \widetilde{\nu}_i \sqrt{\frac{k_B T}{m_{\rm air} c^2}},\tag{24}$$

where $k_{\rm B}$ is the Boltzmann constant, $m_{\rm air}$ is the average mass of air molecules, and *c* is the speed of light. The FWHM of the Gaussian profile is defined as:

$$\Delta \tilde{\nu}_{i,G}^{\text{FWHM}} = 2\sqrt{2\ln 2} \cdot \gamma_G^i.$$
⁽²⁵⁾

The backscatter profile of *i* PRR line homogeneously broadened only by molecular collisions is described by a Lorentzian function (Cauchy distribution) that is defined for the angular frequency ω (rad/s) [22]:

$$L(\omega_i, \omega, T) = \frac{1}{\pi} \cdot \frac{\gamma_L}{(\omega - \omega_i)^2 + \gamma_L^2},$$
(26)

where ω_i is the central angular frequency of the line profile, and γ_L (rad/s) specifies the half width at half maximum (HWHM) of the Lorentzian profile. Subsequently, the FWHM (rad/s) of the Lorentzian profile is defined as:

$$\Delta \omega_{\rm L}^{\rm FWHM} = 2\gamma_{\rm L}.$$
(27)

After the substitution $\omega = 2\pi c \tilde{\nu}$, the Lorentzian function (26) can be expressed as a function of wavenumber:

$$L(\widetilde{\nu}_i, \widetilde{\nu}, T) = \frac{1}{\pi} \cdot \frac{\gamma_{\rm L}/(2\pi c)}{(\widetilde{\nu} - \widetilde{\nu}_i)^2 + (\gamma_{\rm L}/(2\pi c))^2}$$
(28)

with the corresponding FWHM defined in cm⁻¹:

$$\Delta \tilde{v}_{\rm L}^{\rm FWHM} = \frac{\Delta \omega_{\rm L}^{\rm FWHM}}{2\pi c} = \frac{\gamma_{\rm L}}{\pi c},\tag{29}$$

where c is the speed of light in cm/s. For a two-component gas (e.g., a mixture of N_2 and O_2 molecules in air), the

 3.05×10^{-6} cm⁻¹ for the pure Lorentzian function (when $\Delta \tilde{v}_{i,G}^{FWHM} = 0$).

Since the Voigt profile shape in its wings is very close

to the Lorentzian one and the boundaries of SF passbands

are mostly located in the wings of PRR lines (Fig. 3), it is

reasonable to use $L(\tilde{v}_i, \tilde{v}, T)$ (28) instead of $V(\tilde{v}_i, \tilde{v}, T)$ for a

PRR line shape description [15]. Hence, instead of integrals

$$\Delta \tilde{\nu}_{\rm L}^{\rm FWHM} = p_1^2 n_{\rm air} d_1^2 \sqrt{\frac{8k_{\rm B}T}{\pi\mu_1 c^2}} + 2p_1 p_2 n_{\rm air} d_{12}^2 \sqrt{\frac{8k_{\rm B}T}{\pi\mu_{12} c^2}} + p_2^2 n_{\rm air} d_2^2 \sqrt{\frac{8k_{\rm B}T}{\pi\mu_2 c^2}},\tag{30}$$

where $p_1 = 0.7809$ and $p_2 = 0.2095$ are the probabilities to find N₂ and O₂ molecules in the homosphere (0–100 km), respectively; n_{air} is the air molecular number density; d_1 , d_2 , and $d_{12} = (d_1 + d_2)/2$ are the effective optical collision diameters in N₂-N₂, O₂-O₂, and N₂-O₂ collisions, respectively; $\mu_1 = m_1/2$, $\mu_2 = m_2/2$, and $\mu_{12} = m_1m_2/(m_1 + m_2)$ are the

$$X_{\text{low}}^{i}(\widetilde{\nu}_{i},T) = \frac{1}{\pi} \int_{\widetilde{\nu}_{1}}^{\widetilde{\nu}_{2}} \frac{\gamma_{\text{L}}/(2\pi c)}{(\widetilde{\nu} - \widetilde{\nu}_{i})^{2} + (\gamma_{\text{L}}/(2\pi c))^{2}} d\widetilde{\nu} = \frac{1}{\pi} \left[\arctan\left(\frac{\widetilde{\nu}_{2} - \widetilde{\nu}_{i}}{\gamma_{\text{L}}/(2\pi c)}\right) - \arctan\left(\frac{\widetilde{\nu}_{1} - \widetilde{\nu}_{i}}{\gamma_{\text{L}}/(2\pi c)}\right) \right],\tag{33}$$

reduced masses of colliding molecules in N_2-N_2 , O_2-O_2 , and N_2-O_2 collisions, respectively. The temperature dependence of the effective optical collision diameters is described by Sutherland's formula. Considering only binary collisions of molecules, for *i* atmospheric gas we have [24]:

$$d_i^2(T) = d_{i,\infty}^2 \left(1 + \Phi_i / T \right), \tag{31}$$

where $d_{i,\infty}$ is the effective optical collision diameter at $T \rightarrow \infty$, and Φ_i is the constant having the dimension of temperature (K).

The backscatter profile of *i* PRR line broadened by both Doppler effect and molecular collisions is described by a Voigt function. The function represents the convolution of Gaussian and Lorentzian functions and can only be calculated numerically [22]. For this reason, pseudo-Voigt functions, the linear combinations of the Gaussian and Lorentzian functions, are often used to approximate the Voigt ones. To estimate the FWHM (in cm⁻¹) of a pseudo-Voigt function, one can apply the approximation formula proposed in [25]:

$$\Delta \tilde{\nu}_{i,V}^{\text{FWHM}} \approx 0.5346 \Delta \tilde{\nu}_{\text{L}}^{\text{FWHM}} + \sqrt{(\Delta \tilde{\nu}_{i,\text{G}}^{\text{FWHM}})^2 + 0.2166(\Delta \tilde{\nu}_{\text{L}}^{\text{FWHM}})^2}.$$
(32)

This approximation has zero error for the pure Gaussian function (when $\Delta \tilde{v}_{L}^{FWHM} = 0$) and an error of about

$$X_{\text{high}}^{i}(\widetilde{v}_{i},T) = \frac{1}{\pi} \left[\arctan\left(\frac{\widetilde{v}_{4} - \widetilde{v}_{i}}{\gamma_{1}/(2\pi c)}\right) - \arctan\left(\frac{\widetilde{v}_{3} - \widetilde{v}_{i}}{\gamma_{1}/(2\pi c)}\right) \right],$$

which can be easily calculated. Nevertheless, when calculating X_{low}^i and X_{high}^i , we use the HWHM $\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2$ of the pseudo-Voigt function instead of the Lorentzian HWHM $\gamma_{\text{L}} / (2\pi c)$. This allows more accurate taking into account the contribution of broadened PRR lines to both lidar channels.

3.3 PRR line intensity

(21) and (22) we can write:

The intensity $I_i(J_i, T)$ of an individual PRR line can be expressed as [26]:

$$I_i(J_i, T) = PL\beta_{\pi,i}(J_i, T) = PLn_i\sigma_{\pi,i}(J_i, T) = PLn_{air}p_i\sigma_{\pi,i}(J_i, T),$$
(35)

where *P* is the average power of the incident laser beam, *L* is the length of the scattering volume, $\beta_{\pi,i}(J_i, T)$ is the backscatter cross-section (atmospheric backscatter coefficient), $\sigma_{\pi,i}(J_i, T)$ is the differential backscatter cross-section, and $n_i = p_i \cdot n_{air}$ is the partial number density of air component *i*. Substituting Eqs. (33), (34), and (35) into Eq. (17), we obtain for the intensity ratio:

$$Q(T) = \frac{\sum_{J_i} \sum_{i=N_2,O_2} \left\{ p_i \sigma_{\pi,i}(J_i, T) \left[\arctan\left(\frac{\tilde{v}_2 - \tilde{v}_i}{\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2}\right) - \arctan\left(\frac{\tilde{v}_1 - \tilde{v}_i}{\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2}\right) \right] \right\}}{\sum_{J_i} \sum_{i=N_2,O_2} \left\{ p_i \sigma_{\pi,i}(J_i, T) \left[\arctan\left(\frac{\tilde{v}_4 - \tilde{v}_i}{\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2}\right) - \arctan\left(\frac{\tilde{v}_3 - \tilde{v}_i}{\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2}\right) \right] \right\}}.$$
(36)

(34)



Fig.4 a–e Sets 1–5 of SF passbands $(\tilde{v}_1; \tilde{v}_2)$ and $(\tilde{v}_3; \tilde{v}_4)$ with equal transmission function F=1 in lidar channels J_{low} and J_{high} , respectively. The index over a spectral line denotes the rotational quantum

number J of the initial state of the transition. N₂ and O₂ PRR spectrum corresponds to T=280 K

4 Initial conditions for the simulation

Let us consider five sets of SF passbands that are mostly used in PRR lidar receiving systems (Fig. 4). We assume that a SF has a narrow passband if its width $\Delta \tilde{v} \leq 25 \text{ cm}^{-1}$ and a wide one at $\Delta \tilde{v} > 40 \text{ cm}^{-1}$. The first set consists of SFs with wide passbands in both channels J_{low} and J_{high} [27–30]. The second set has a SF with a narrow passband in channel J_{low} and a SF with a wide passband in channel J_{high} [13, 23, 31, 32]. The third and fourth sets consist of SFs with equal narrow passbands in both PRR channels [5, 8, 16, 33], but with different central wavenumber positions in channel J_{high} . The fifth set has two SFs with very narrow passbands provided by a Fabry–Perot interferometer [18]. The SF passbands $(\tilde{v}_1; \tilde{v}_2)$ and $(\tilde{v}_3; \tilde{v}_4)$ of channels J_{low} and J_{high} , their widths $\Delta \tilde{v}$, and N₂ and O₂ PRR lines (with *J*) falling into the channels are shown in Table 1.

A narrow-linewidth (~0.001 cm⁻¹) laser operating at wavelengths of 354.67 and 532 nm is considered as a PRR lidar transmitter in the simulation. Such a linewidth can be ignored compared to the widths of PRR lines broadened by both Doppler effect and molecular collisions (Fig. 2). We take into account the contribution from 56 N₂ and O₂ PRR lines to the signals detected in channels

	SFP set 1		SFP set 2		SFP set 3		SFP set 4		SFP set 5	
	$(\widetilde{v}_1,\widetilde{v}_2)$	$(\widetilde{\mathcal{V}}_3,\widetilde{\mathcal{V}}_4)$	$(\widetilde{\mathcal{V}}_1;\widetilde{\mathcal{V}}_2)$	$(\widetilde{\mathcal{V}}_3;\widetilde{\mathcal{V}}_4)$	$(\widetilde{v}_1; \widetilde{v}_2)$	$(\widetilde{\mathcal{V}}_3;\widetilde{\mathcal{V}}_4)$	$(\widetilde{v}_1; \widetilde{v}_2)$	$(\widetilde{\mathcal{V}}_3;\widetilde{\mathcal{V}}_4)$	$(\widetilde{V}_1;\widetilde{V}_2)$	$(\widetilde{\mathcal{V}}_3;\widetilde{\mathcal{V}}_4)$
$SFP (cm^{-1})$	(23;65)	(80;135)	(30;55)	(85;135)	(30;55)	(87;112)	(30;55)	(112;137)	(43.2;44.3)	(122.8;123.9)
SFP width $\Delta \widetilde{v} \ (cm^{-1})$	42	55	25	50	25	25	25	25	1.1	1.1
N_2 lines	5 lines J=4, 5, 6, 7, 8	7 lines J=11, 12, 13,,17	3 lines $J = 5, 6, 7$	6 lines J=12, 13, 14,,17	3 lines $J = 5, 6, 7$	3 lines $J = 12, 13, 14$	3 lines $J = 5, 6, 7$	3 lines J = 15, 16, 17	1 line $J=6$	1 line $J = 16$
O_2 lines	4 lines J=5, 7, 9, 11	5 lines J= 15, 17, 19, 21, 23	2 lines $J=7, 9$	4 lines <i>J</i> =17, 19, 21, 23	2 lines $J=7, 9$	2 lines $J = 17, 19$	2 lines $J=7, 9$	2 lines $J = 21, 23$		

 Table 1
 Parameters of spectral filter passbands (SFPs)



Fig. 5 Tropospheric temperature profile of the U.S. Standard Atmosphere (1976)



Fig. 6 Tropospheric temperature vs intensity ratios $Q_{354.67}$ calculated for five sets of SF passbands (Fig. 4)

 J_{low} and J_{high} . These lines include the first 34 N₂ lines with J = 0, 1, ..., 16 (Stokes branch) and J = 2, 3, ..., 18(anti-Stokes branch) and 22 O_2 lines with J = 1, 3, ..., 21and J=3, 5, ..., 23 in the Stokes and anti-Stokes branches, respectively. The values of the constants required for calculating the FWHMs and/or HWHMs of the Gaussian (25), Lorentzian (30), and pseudo-Voigt (32) profiles are the following: $m_{\rm air} = 4.81 \times 10^{-26}$ kg, $m_1 = 4.65 \times 10^{-26}$ kg, $m_2 = 5.31 \times 10^{-26}$ kg, $d_{1,\infty} = 3.51 \times 10^{-10}$ m, $d_{2,\infty} = 3.52 \times 10^{-10}$ m, $d_{12,\infty} \approx 3.515 \times 10^{-10}$ m [34], $\Phi_1 = 105$ K (for N₂-N₂ collisions), $\Phi_2 = 125$ K (for O₂-O₂ collisions), and $\Phi_{12} = 115$ K (for N₂–O₂ collisions) [24]. The tropospheric (0–11 km) temperature profile of the U.S. Standard Atmosphere (1976) [35] is used as a reference profile (Fig. 5) to set the dependence of temperature on altitude in Eqs. (24), (30)–(36) and to determine the calibration coefficients of TRFs 1-9 using the least squares method. The formulas and all the necessary constants for calculating the cross-sections $\sigma_{\pi i}(J_i, T)$ and intensity ratio (36) can be found in [4].



Fig. 7 Calibration errors $\Delta T_{354.67}$ produced using TRFs 1–9 for SFP set 1 at $\lambda = 354.67$ nm



Fig. 8 Calibration errors $\Delta T_{354.67}$ produced using TRFs 1–9 for SFP set 2 at $\lambda = 354.67$ nm



Fig. 9 Calibration errors $\Delta T_{354.67}$ produced using TRFs 1–9 for SFP set 3 at $\lambda = 354.67$ nm

5 Simulation results for $\lambda = 354.67$ nm

The simulation results for a laser wavelength of 354.67 nm are shown in Figs. 6, 7, 8, 9, 10 and 11. Figure 6 presents the dependences of tropospheric temperature on the intensity ratios $Q_{354.67}$ calculated for five sets of SF passbands (Fig. 4, Table 1) using Eq. (36) under the conditions described above. To determine the best TRF for each of SFP sets 1–5, we intercompare temperature errors produced using TRFs 1–9. A temperature error (or calibration error) ΔT is defined

as the difference between an ideal model profile and a temperature profile T = T(Q) retrieved from a simulated intensity ratio Q by one of the TRFs. The function that retrieves temperature with the smallest maximum calibration error in the troposphere will be considered as the best TRF. The calibration errors $\Delta T_{354.67}$ for each of SFP sets 1–5 are intercompared in Figs. 7, 8, 9, 10, 11, respectively.

A comparative analysis of $\Delta T_{354.67}$ shows that in all five cases of SFP sets there are TRFs, the use of which is preferable for temperature retrievals and leads to smaller errors



Fig. 10 Calibration errors $\Delta T_{354.67}$ produced using TRFs 1–9 for SFP set 4 at $\lambda = 354.67$ nm



Fig. 11 Calibration errors $\Delta T_{354.67}$ produced using TRFs 1–9 for SFP set 5 at $\lambda = 354.67$ nm



Fig. 12 Calibration errors $\Delta T_{354.67}$ produced using TRFs 3, 7, and 9 for SFP sets 1–5 at λ = 354.67 nm

than that of the other functions. TRF 3 gives the smallest errors of all three-coefficient TRFs 1–6 for SFP sets 1, 2, and 4 (Figs. 7b, 8b, and 10b), whereas TRF 1 and TRF 4 are the best three-coefficient functions for SFP sets 3 and 5 (Figs. 9b and 11b), respectively. Four-coefficient TRF 7 gives the smallest errors of all TRFs 1–9 for SFP sets 1, 2, and 4 (Figs. 7c, 8c, and 10c), whereas TRF 9 is the best function for SFP sets 3 and 5 (Figs. 9c and 11c). In total, as seen in Figs. 7, 8, 9, 10, 11, the use of TRFs 3, 7, and 9 for temperature retrievals consistently leads to small calibration errors regardless of the SFP set. Namely, $|\Delta T_{354.67}|$ does not exceed the value of 3×10^{-3} K when using TRF 3, while $|\Delta T_{354.67}| < 4 \times 10^{-4}$ K for both TRFs 7 and 9 (Fig. 12). Note that the use of TRF 6 yields comparatively high calibration errors for all sets of SF passbands, especially for SFP set 5. This can be explained by the fact that the CF corresponding to TRF 6 does not satisfy the selection rules introduced in [17] for special cases of the GCF (7) and it was considered as an exception. Recall that this nonlinear CF cannot be reduced to the linear CF (2) when excluding



Fig. 13 Tropospheric temperature vs the differences between the intensity ratios $Q_{354,67}$ and Q_{532} calculated for each of SFP sets 1–5

from consideration all nonlinear effects caused by PRR lines broadening.

As follows from Fig. 12b, TRF 7 more accurately takes into account the contribution from broadened PRR lines to the signals detected in both lidar channels for four out of five SFP sets (excluding SFP set 3). Hence, TRF 7 can be considered as the function most suited for tropospheric temperature retrievals for any set of SF passband widths (for $\lambda = 354.67$ nm). This is in agreement with the results obtained in [17] for temperature measurements using a PRR lidar at $\lambda = 354.67$ nm.

6 Simulation results for $\lambda = 532$ nm

The simulation for $\lambda = 532$ nm shows similar results as for $\lambda = 354.67$ nm. Figure 13 presents the differences $\Delta Q = Q_{354.67} - Q_{532}$ between the intensity ratios $Q_{354.67}$ (Fig. 6) and Q_{532} (calculated at $\lambda = 532$ nm) for each of SFP sets 1–5. For example, the value of $Q_{354.67}$ varies between 3.5 and 7.5 for SFP set 5, while the corresponding $|\Delta Q| < 2.5 \times 10^{-4}$. Such small values of ΔQ are explained by the following: as mentioned in Sects. 2.1 and 3.2, the molecular collision effect dominates over the Doppler one in the troposphere (Fig. 2) and the homogeneous collisional broadening of PRR lines does not depend on wavelength (see Eq. (30)). Therefore, the PRR line broadening provides almost the same contribution to channels J_{low} and J_{high} for the lidar wavelengths of 354.67 and 532 nm. This leads to close values of $Q_{354.67}$ and Q_{532} .

For space considerations, the intercomparisons of calibration errors ΔT_{532} produced using TRFs 1–9 for each of SFP sets 1–5 at $\lambda = 532$ nm along with the differences $\Delta T_{354.67}$ – ΔT_{532} can be found in the electronic supplementary material. The errors ΔT_{532} produced using TRFs 3, 7, and 9 and the differences $\Delta T_{354.67} - \Delta T_{532}$ (Fig. 14) confirm the conclusion drawn for $\Delta T_{354.67}$ (Fig. 12), i.e., TRF 7 is most suited for tropospheric temperature retrievals for any set of SF passband widths (for $\lambda = 532$ nm). An intercomparison of $\Delta T_{354.67}$ and ΔT_{532} for TRFs 3, 7, and 9 (Figs. 12 and 14a–c) does not allow us to unambiguously determine the



Fig. 14 a-c Calibration errors ΔT_{532} produced using TRFs 3, 7, and 9 for SFP sets 1–5 at $\lambda = 532$ nm. d–f differences $\Delta T_{354,67} - \Delta T_{532}$

best option from the considered sets of SF passband widths. However, the following can be stated: the use of SFP sets 1 and 3 results in larger calibration errors than that of SFP sets 2, 4, and 5.

7 Summary

In this study, we have calculated the ratios Q(T) of backscattered signal intensities from two PRR spectrum bands taking into account the collisional broadening of N₂ and O₂ PRR lines. The line broadening due to the Doppler effect was also considered using the HWHM $\Delta \tilde{v}_{i,V}^{\text{FWHM}} / 2$ of the pseudo-Voigt function instead of the Lorentzian HWHM $\gamma_L/(2\pi c)$ in Eq. (36). The numerical simulation was performed for five frequently used sets of SF passband widths (Fig. 4, Table 1) and two laser wavelengths (354.67 and 532 nm). To obtain temperature profiles from the calculated ratios Q(T), we applied nine nonlinear CFs (TRFs) in the temperature retrieval algorithm of the traditional PRR lidar technique.

The comparative analysis of the calibration errors $\Delta T_{354.67}$ and ΔT_{532} , produced using TRFs 1–9, and differences $\Delta T_{354.67} - \Delta T_{532}$ for each of SFP sets 1–5 allow us to reveal the following:

- TRF 3 is the best function for tropospheric temperature retrievals of all three-coefficient TRFs 1–6 for SFP sets 1, 2, and 4, while TRF 1 and TRF 4 are the best ones for SFP sets 3 and 5, respectively;
- four-coefficient TRF 7 gives the smallest errors of all TRFs 1–9 for SFP sets 1, 2, and 4, whereas TRF 9 is the best function for SFP sets 3 and 5;
- when calculating the intensity ratios Q(T), TRF 7 more accurately takes into account the contribution from broadened N₂ and O₂ PRR lines for four out of five SFP sets (excluding SFP set 3) at λ of 354.67 and 532 nm;
- the use of SFP sets 1 and 3 leads to larger calibration errors than that of SFP sets 2, 4, and 5;
- For two wavelengths (354.67 and 532 nm) and SFP sets 1–5, the absolute error |ΔT| does not exceed the value of 3×10⁻³ K when using TRF 3, while |ΔT| < 4×10⁻⁴ K for both TRFs 7 and 9 (Figs. 12 and 14a–c).

In total, TRFs 3, 7, and 9 can be recommended for use in the temperature retrieval algorithm regardless of the lidar wavelength and set of SF passbands.

Despite two new techniques [18, 19] do not require lidar calibration with external temperature measurement instruments and have several advantages over the traditional technique, the accuracy of temperature retrievals can be increased by selecting TRFs 3, 9, or better TRF 7. Therefore, if one wants to measure tropospheric temperature with

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an accuracy as high as possible, the traditional PRR lidar technique is the most preferable.

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Compliance with ethical standards

Conflict of interest The author declares that he has no conflict of interest.

References

- 1. J. Cooney, J. Appl. Meteorol. 11(1), 108 (1972)
- Y.F. Arshinov, S.M. Bobrovnikov, V.E. Zuev, V.M. Mitev, Appl. Opt. 22(19), 2984 (1983)
- D. Nedeljkovic, A. Hauchecorne, M.L. Chanin, IEEE Trans. Geosci. Remote Sens. 31(1), 90 (1993)
- A. Behrendt, in *Temperature measurements with lidar*, ed. by C. Weitkamp. Lidar, range-resolved optical remote sensing of the atmosphere (Springer, New York, 2005), pp. 273–305
- J. He, S. Chen, Y. Zhang, P. Guo, H. Chen, J. Geophys. Res. Atmos. 123(19), 10925 (2018)
- Q. Yan, Y. Wang, T. Gao, F. Gao, H. Di, Y. Song, D. Hua, Appl. Opt. 58(19), 5170 (2019)
- A. Behrendt, T. Nakamura, M. Onishi, R. Baumgart, T. Tsuda, Appl. Opt. 41(36), 7657 (2002)
- J. Su, M.P. McCormick, Y.H. Wu, R.B. Lee III, L.Q. Lei, Z.Y. Liu, K.R. Leavor, J. Q. Spectrosc. Radiat. Transf. **125**, 45 (2013)
- H. Chen, S.Y. Chen, Y.C. Zhang, P. Guo, H. Chen, B.L. Chen, Opt. Express 23(16), 21232 (2015)
- R.K. Newsom, D.D. Turner, J.E.M. Goldsmith, J. Atmos. Ocean. Tech. 30(8), 1616 (2013)
- H. Chen, S.Y. Chen, Y.C. Zhang, P. Guo, H. Chen, B.L. Chen, J. Geophys. Res. Atmos. **121**(6), 2805 (2016)
- J. He, S. Chen, Y. Zhang, P. Guo, H. Chen, Opt. Commun. 452, 88 (2019)
- 13. A. Behrendt, J. Reichardt, Appl. Opt. 39(9), 1372 (2000)
- R.B. Lee III, Tropospheric temperature measurements using a rotational Raman lidar (PhD dissertation) (Ann Arbor, ProQuest LLC, 2013) 112 pp. https://pqdtopen.proquest.com/doc/14376 52821.html?FMT=ABS. Accessed 21 Sep 2020
- 15. V.V. Gerasimov, V.V. Zuev, Opt. Express **24**(5), 5136 (2016)
- V.V. Zuev, V.V. Gerasimov, V.L. Pravdin, A.V. Pavlinskiy, D.P. Nakhtigalova, Atmos. Meas. Tech. 10(1), 315 (2017)
- 17. V.V. Gerasimov, Appl. Phys. B 124(7), 134 (2018)
- M. Weng, F. Yi, F. Liu, Y. Zhang, X. Pan, Opt. Express 26(21), 27555 (2018)
- S. Mahagammulla Gamage, R.J. Sica, G. Martucci, A. Haefele, Atmos. Meas. Tech. 12(11), 5801 (2019)
- 20. E. Hammann, A. Behrendt, Opt. Express 23(24), 30767 (2015)
- U. Wandinger, in *Raman Lidar*, ed. by C. Weitkamp. Lidar, rangeresolved optical remote sensing of the atmosphere (Springer, New York, 2005), pp. 241–271
- R.M. Measures, Laser remote sensing, fundamentals and applications (Wiley, NewYork, 1984)
- 23. M. Radlach, A. Behrendt, V. Wulfmeyer, Atmos. Chem. Phys. **8**(2), 159 (2008)
- Y.I. Gerasimov, *Course in Physical Chemistry*, Vol. 2 (Khimiya, Moscow, 1973), p. 624 (in Russian)
- J.J. Olivero, R.L. Longbothum, J. Quant. Spectr. Rad. Transfer 17(2), 233 (1977)

- C.M. Penney, R.L.St. Peters, M. Lapp, J. Opt. Soc. Am. 64(5), 712 (1974)
- 27. Y.J. Li, S.L. Song, F.Q. Li, X.W. Cheng, Z.W. Chen, L.M. Liu, Y. Yang, S.S. Gong, Chinese. J. Geophys. **58**(4), 313 (2015)
- D. Wu, Z. Wang, P. Wechsler, N. Mahon, M. Deng, B. Glover, M. Burkhart, W. Kuestner, B. Heesen, Opt. Express 24(18), A1210 (2016)
- Y.J. Li, X. Lin, S.L. Song, Y. Yang, X.W. Cheng, Z.W. Chen, L.M. Liu, Y. Xia, J. Xiong, S.S. Gong, F.Q. Li, IEEE Trans. Geosci. Remote Sens. 54(12), 7055 (2016)
- Y.J. Li, X. Lin, Y. Yang, Y. Xia, J. Xiong, S.L. Song, L.M. Liu, Z.W. Chen, X.W. Cheng, F.Q. Li, J. Quant. Spectrosc. Radiat. Transf. 188(2), 94 (2017)

- P. Achtert, M. Khaplanov, F. Khosrawi, J. Gumbel, Atmos. Meas. Tech. 6(1), 91 (2013)
- A. Behrendt, T. Nakamura, T. Tsuda, Appl. Opt. 43(14), 2930 (2004)
- 33. J.Y. Jia, F. Yi, Appl. Opt. 53(24), 5330 (2014)
- 34. P.A. Bazhulin, Sov. Phys. Usp. 5(4), 661 (1963)
- https://ntrs.nasa.gov/archive/nasa/casi.ntrs.nasa.gov/1977000953
 9.pdf. Accessed 21 Sep 2020

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