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## Study on the concentration retrieval of $\text{SO}_2$ and $\text{NO}_2$ in mixed gases based on the improved DOAS method

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$\text{NO}_2$  and  $\text{SO}_2$  are important components of air pollutants, and their absorption spectra are superimposed at 193–253 nm. The superposed spectra affect the gas concentration retrieval based on the ultraviolet differential optical absorption spectroscopy (DOAS) method. In this study, a suitable wavelength band was chosen for concentration retrieval, moreover, the characteristics of the quasi-periodic variation of absorption cross-section with wavelength was given sufficient attention and then the superposed spectra were separated by the Fast Fourier transform (FFT) method. The concentration of the gases to be measured was calculated according to the relationship between the amplitude of absorbance after FFT and the gas concentration. The experimental results prove that by using an absorption cell with a 700 mm optical path, the relative deviation absolute value of the retrieval concentration of  $\text{SO}_2$  in a  $\text{NO}_2$  and  $\text{SO}_2$  gas mixture is less than 1.471%, and that of  $\text{NO}_2$  in a  $\text{NO}_2$  and  $\text{SO}_2$  gas mixture is less than 7.207%. The method has good adaptability, high detection precision, whether single  $\text{SO}_2$ ,  $\text{NO}_2$  or a mixture of both, and important reference value for the development of DOAS and future research on the high-precision detection of more types of mixed gases in the ultraviolet band, such as gas mixtures of  $\text{NO}_2$ ,  $\text{SO}_2$  and  $\text{NO}$  in flue gas.

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### 1. Introduction

Controlling the release of air pollutants is an important part of ecological environment protection.<sup>1</sup>  $\text{NO}_2$  and  $\text{SO}_2$  play a predominant role in atmospheric pollutants.  $\text{SO}_2$  and  $\text{NO}_2$  in the air mainly come from the combustion of fossil fuels, such as thermal power plant exhaust emissions, motor vehicle exhaust emissions and boiler flue gas emissions.<sup>2,3</sup>  $\text{SO}_2$  and  $\text{NO}_2$  could cause building corrosion, acid rain, chemical smoke, air contamination and damage to human health,<sup>1</sup> so the measurement technique for  $\text{SO}_2$  and  $\text{NO}_2$  has important application value.<sup>2–4</sup>

At present, the methods of detecting  $\text{NO}_2$  and  $\text{SO}_2$  mainly include metal oxide sensor methodology<sup>5–8</sup> and spectroscopic methodology. Metal oxide sensor is widely used because of low price while the stability of metal oxide sensor will decrease with the increase of working time, resulting in excessive deviations in measurement results.<sup>1,5</sup> Spectroscopic methodology has the advantages of high reliability, low economic cost, easy maintenance and strong scalability. Spectroscopic methodology is also divided into chemiluminescence (CL),<sup>9</sup> tunable diode laser absorption spectroscopy (TDLAS),<sup>4</sup> non-dispersive infrared

spectroscopy (NDIR),<sup>2,10</sup> differential optical absorption spectroscopy (DOAS) and photoacoustic spectroscopy (PAS),<sup>11</sup> etc. *CL* is to convert  $\text{NO}_2$  into  $\text{NO}$  and then to measure the concentration of  $\text{NO}$ . Its advantages are large linear range and good sensitivity but its disadvantage is easy to convert  $\text{NO}_x$  into  $\text{NO}$ , resulting in measurement deviations increase.<sup>12</sup> The infrared light used in NDIR is susceptible to interference from water-vapour absorption and poor species selectivity of gases detection.<sup>13,14</sup> TDLAS has high detection accuracy but only detects one gas at a time, furthermore, the equipment is expensive and poor scalability.<sup>1</sup> PAS has high environmental requirement, is vulnerable to the interference from environmental noise and only detects one gas at a time. DOAS usually use deuterium lamp or xenon lamp as detection system light source so it has wide detection wavelength and can detect several kinds of gases simultaneously with low cost relative to other method of gas detection. However, because of the poor collimation of deuterium lamp, the optical path of DOAS is shorter than other method so DOAS has limited detection accuracy. DOAS has also the advantages of high selectivity, high reliability, excellent stability and high anti-interference performance,<sup>15–17</sup> so it has good economic applicability and broad application prospects. To avoid difficulties in data processing caused by the superposition of gases absorption spectra, the detection of  $\text{SO}_2$  and  $\text{NO}_2$ , in traditional DOAS measurements, usually uses 290 nm–315 nm (ref. 18) and 323 nm–335 nm (ref. 18) respectively. However, with the progress of Chinese environmental policy,

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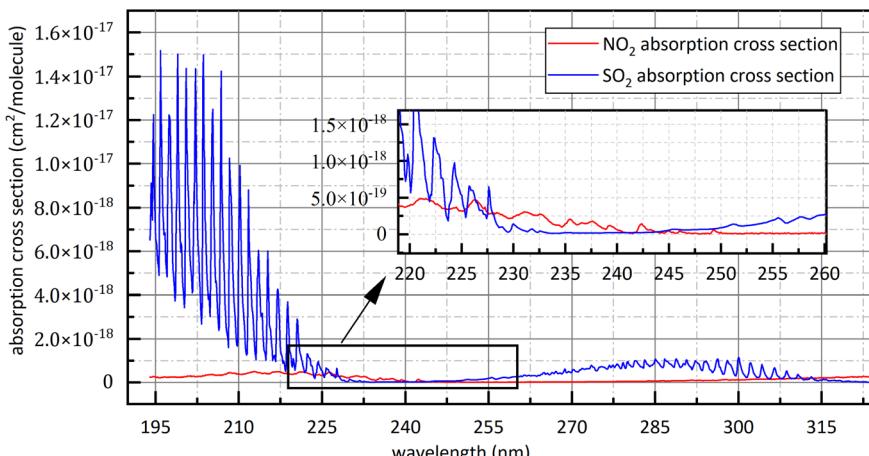


Fig. 1 The absorption cross-section of  $\text{SO}_2$  and  $\text{NO}_2$  at 193 nm–325 nm.<sup>22</sup>

the release of  $\text{NO}_2$  and  $\text{SO}_2$  has subjected to more stringent.<sup>20</sup> For example, Chinese government issued that the concentration of  $\text{NO}_2$  and  $\text{SO}_2$  emitted by thermal power plants shouldn't exceed 48.7 ppm and 35 ppm respectively in 2011.<sup>21</sup> The  $\text{SO}_2$  absorption cross-section at 290 nm–315 nm is small as shown in Fig. 1,<sup>22</sup> so the signal-to-noise ratio of  $\text{SO}_2$  spectral signal is small under very low emission conditions. Moreover, in order to obtain ultraviolet (UV) continuous spectrum, deuterium lamps are often used as light sources in detection system.<sup>1</sup> However, deuterium lamp is dark at 323 nm–335 nm as show in Fig. 2. It isn't conducive to obtain sufficient signal-to-noise ratio for  $\text{NO}_2$  absorption spectral signal. The above problems limit the use of DOAS technology in the field of multi-gas simultaneous detection and high-precision detection, for example, flue gases composition detection. Compared with the traditional band at 290 nm–315 nm,  $\text{SO}_2$  and  $\text{NO}_2$  have relatively big absorption cross-section at 193 nm–253 nm, and deuterium light is strong in this interval. They are beneficial to obtain high signal-to-noise ratio. However, the absorption cross-section of  $\text{SO}_2$  and  $\text{NO}_2$  at 193 nm–253 nm is continuous, so aliasing phenomenon exists. It brings difficulties to data processing.

Facing the above problems, Bo Peng *etc.*<sup>1,21,23</sup> studied  $\text{SO}_2$  in single gas and the mixed gases of  $\text{NO}_2$ ,  $\text{NO}$  and  $\text{SO}_2$  based on FFT and inverse Fourier transform method at 206 nm–213 nm.  $\text{SO}_2$  was measured in the concentration range from 1 ppm to 30 ppm with the maximum deviation of 0.24 ppm. However, single  $\text{NO}_2$  and the  $\text{NO}_2$  in mixed gases need to be studied further. In addition, the spectral separation method he used can be further improved to remove well the influence of superposed spectra.

This paper made full use of the characteristic of quasi-periodic variation of absorption cross-section with wavelength of the gases to be measured. The absorbance was subjected to FFT and then the concentrations of  $\text{SO}_2$  and  $\text{NO}_2$  were retrieved according to the relationship between the amplitude of absorbance after FFT and the concentration of the gases to be measured. The experimental results have shown that this method can separate superposed spectra in mixed gases measurement. This method is suitable for the gas concentration retrieval whose absorption cross-section varies quasi-periodically with wavelength. It is helpful for the separation of superposed absorption spectra. It has strong anti-interference ability and provides important reference value for the development of gases detection instrument based on DOAS principle.

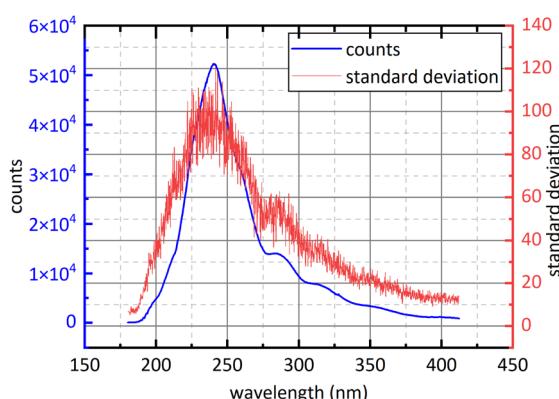


Fig. 2 The emission spectrum of the deuterium lamp with integral time of 19 ms.

## 2. Theory

### 2.1 Differential absorption spectrum

The propagation of light at the specific wavelength in the specific gas can be expressed by Lambert-Beer law as shown in eqn (1).<sup>1,14,24</sup> Where  $I_0(\lambda)$  is the light intensity at the wavelength  $\lambda$  which isn't absorbed by the gas to be measurement,  $I(\lambda)$  is the light intensity of transmission out absorption cell through gas absorption,  $\sigma(\lambda)$  is the absorption cross-section of the gas to be measured ( $\text{cm}^2$  per molecule),  $C$  is the gas concentration (molecule per  $\text{cm}^3$ ), and  $L$  is the optical path (cm) of light propagation in the gas.

$$I(\lambda) = I_0(\lambda) \times \exp[-\sigma(\lambda)CL] \quad (1)$$



In DOAS theory, the gas absorption cross-section  $\sigma(\lambda)$  is composed of two parts as shown in eqn (2).<sup>14</sup> The first part is fast-varying part  $\sigma^f(\lambda)$  that varies rapidly with wavelength. The second part is slow-varying part  $\sigma^s(\lambda)$  that varies slowly with wavelength. Hence, eqn (1) can be adjusted to eqn (2).<sup>14</sup>

$$I(\lambda) = I_0(\lambda) \times \exp[-(\sigma^f(\lambda) + \sigma^s(\lambda))CL] \quad (2)$$

In addition, Rayleigh scattering and meter scattering of gas molecules also can reduce initial light intensity. They varies more slowly with wavelength than slow-varying part, so eqn (1) can be revised as eqn (3).<sup>24</sup>

$$I(\lambda) = I_0(\lambda) \times \exp[-(\sigma^f(\lambda) + \sigma^s(\lambda))CL - \varepsilon_R(\lambda) - \varepsilon_M(\lambda)] \quad (3)$$

Since nitrogen has almost no absorb at 193 nm–253 nm, only Rayleigh and Mie scattering, Rayleigh and Mie scattering can be replaced by completely filling absorption cell with nitrogen. When the gas chamber passes into nitrogen gas, the light intensity received by spectrometer is  $I'_0(\lambda)$  as shown in eqn (4).<sup>24</sup> Take the logarithm of eqn (3) as shown in eqn (5).  $A(\lambda)$  is absorbance in eqn (5).

$$I'_0(\lambda) = I_0(\lambda) \times \exp[-(\varepsilon_R(\lambda) + \varepsilon_M(\lambda))] \quad (4)$$

$$A(\lambda) = \ln\left(\frac{I'_0(\lambda)}{I(\lambda)}\right) = (\sigma^f(\lambda) + \sigma^s(\lambda))CL \quad (5)$$

The absorbance expressed in eqn (5) has the aliasing effect of fast-varying part and slow-varying part. In order to improve signal-to-noise ratio and eliminate the influence of hardware device on absorbance, slow-varying part can be filtered out by filtering method, and the concentration of the gas to be measurement can be expressed by the information of fast-varying part.<sup>25,26</sup> The remaining part after filtering the slow-varying part is defined as differential absorbance  $DOD(\lambda)$  as described in eqn (6).<sup>14</sup>

$$DOD(\lambda) = \sigma^f(\lambda)CL \quad (6)$$

According to eqn (6), the linear relationship between the gas concentration  $C$  and differential absorbance  $DOD(\lambda)$  can be obtained. It is the theoretical basis for the concentration retrieval of DOAS.

## 2.2 Spectrum superposition law

In fact, *in situ* measurement the gases to be measured is often the mixture of several kinds of gases, and their absorption spectrum will superpose at the wave band to be measured. The absorption spectrum of several kinds of gases at the same wavelength can be expressed by spectrum superposition law as shown in eqn (7).<sup>24</sup>  $\sigma_i^f(\lambda)$  and  $\sigma_i^s(\lambda)$  are the fast-varying part and slow-varying part of the  $i$ -th gas at the wavelength  $\lambda$  respectively.  $I(\lambda)$  is the transmission intensity of the light passing through the gases to be measured.  $C_i$  is the concentration of the  $i$ -th gas. Other parameters are defined as the same as eqn (3). Rayleigh scattering and Mie scattering are treated as single gas. The

absorbance equation of the mixed gases is given as eqn (8). The remaining part after filtering out slow-varying part is defined as differential absorbance  $DOD(\lambda)$  of the mixed gases.<sup>24</sup>

$$I(\lambda) = I_0(\lambda) \times \exp\left[-\sum_{i=1}^n (\sigma_i^f(\lambda) + \sigma_i^s(\lambda))C_iL - \varepsilon_R(\lambda) - \varepsilon_M(\lambda)\right] \quad (7)$$

$$A(\lambda) = \ln\left(\frac{I'_0(\lambda)}{I(\lambda)}\right) = \sum_{i=1}^n (\sigma_i^f(\lambda) + \sigma_i^s(\lambda))C_iL \quad (8)$$

$$DOD(\lambda) = \sum_{i=1}^n \sigma_i^f(\lambda)C_iL \quad (9)$$

The absorbance  $A(\lambda)$  of the mixed gases contains the concentration information of several kinds of gases, so it is difficult to find a suitable algorithm to completely filter out the slow-varying part of various components in the mixed gases. It is also one of the reasons that hinder the extensive use of DOAS.

Fortunately, the absorption cross-section of  $SO_2$  at 193 nm–225 nm and 280 nm–315 nm as shown in Fig. 1 show the characteristic of quasi-periodic variation, and the energy in frequency domain is relatively centralized. The level of frequency domain energy is related to gas concentration, and the position of frequency domain energy is related to gas type.<sup>18</sup> In frequency domain, we can avoid the mutual interference from different kinds of gases.<sup>18</sup> The similar characteristic can be observed at the absorption cross-section of  $NO_2$  at 200 nm–253 nm. They provide conditions for the separation of the superposed spectra of  $SO_2$  and  $NO_2$  at 193 nm–253 nm. According to the above analysis results, absorbance was firstly treated by the method of FFT in this study and then gas concentration was retrieved by using the relationship between the amplitude of absorbance after FFT and the gas concentration to be measured.

## 2.3 Selection of the study band

Firstly, in study band, light source should have sufficient intensity to ensure sufficient signal-to-noise ratio and large concentration measurement range. In order to avoid the superposition of the absorption spectra of different kinds of gases, 323 nm–335 nm is often used for  $NO_2$  concentration retrieval.<sup>19</sup> The emission spectrum of deuterium lamp is shown in Fig. 2. At 323 nm–335 nm, deuterium lamp has small light intensity, so previous measurements of  $NO_2$  in this band had small signal-to-noise ratio and small concentration measurement range.

Secondly, the gases absorption cross-section at study band should varies quasi-periodically with wavelength and should be as large as possible. At 193 nm–225 nm and 275 nm–313 nm,  $SO_2$  shows completely different absorption characteristics<sup>27,28</sup> as shown in Fig. 1. Compared with 275 nm–313 nm,  $SO_2$  has larger absorption cross-section and higher oscillation frequency at 193 nm–225 nm, so the spectral signal of  $SO_2$  has higher signal-to-noise ratio at 193 nm–225 nm. Therefore, 193 nm–223 nm



was chosen for  $\text{SO}_2$  study. The absorption cross-section of  $\text{NO}_2$  quasi-periodically varies at 193 nm–223 nm band. However, the absorption cross-section of  $\text{SO}_2$  in this band is dozens of times that of  $\text{NO}_2$ , so spectral signal of  $\text{NO}_2$  is easily overwhelmed by that of  $\text{SO}_2$  when the gases to be measured is the mixed gases of  $\text{NO}_2$  and  $\text{SO}_2$ . The absorption cross-section of  $\text{NO}_2$  at 228 nm–253 nm varies quasi-periodically with wavelength, and deuterium lamp also has big light intensity. They provide good conditions for  $\text{NO}_2$  study. Therefore, in this study, 228 nm–253 nm was chosen for  $\text{NO}_2$  study. Besides, it is known in Fig. 1 that at study band the absorption cross-section of  $\text{NO}_2$  is superimposed with that of  $\text{SO}_2$ . It is therefore necessary to measure the mixture of  $\text{SO}_2$  and  $\text{NO}_2$  to verify the applicability of separation algorithm.

### 3. Experiments

#### 3.1 Experimental setup and principle

The schematic diagram of the experiment is shown in Fig. 4. The light source of the detection system is deuterium lamp (Hamamatsu L6301, Japan). The effective spectrum range of the deuterium lamp is from 185 nm to 400 nm and its emission spectrum is shown in Fig. 2. The light emitted by the deuterium lamp is coupled into an anti-UV quartz fiber. The anti-UV quartz fiber has little light intensity loss and its numerical aperture is 0.22. The outgoing light of the optical fiber enters a homemade gas absorption cell. The design of the absorption cell will be detailed later. Photons at the specific wavelength are absorbed

by the specific gas molecules in the absorption cell. Remaining unabsorbed light is transmitted out the absorption cell and transmitted to a UV spectrometer (GanWei GW-5040, China) by another anti-UV quartz fiber. The spectrometer can transmit spectral signal to computer by a data line. Due to the use of incoherent light source, the interference between the light can be ignored.<sup>18</sup> The resolution of the spectrometer is 0.1 nm and its detectable wavelength range is from 180 nm to 400 nm. Tested gases are discharged into atmosphere after tail gases treatment.

The light trace of the absorption cell is shown in Fig. 3. The outgoing light of the optical fiber connected to the deuterium lamp was reflected by a parabolic collimator (Thorlabs MPD01M9-F01, USA) into the absorption cavity with melting quartz window glass. UV-reinforced aluminum has high reflectivity and melting quartz window glass absorbs little in ultraviolet band. They can reduce the loss of light intensity. After the light in the absorption cavity is absorbed by gases for the first time, it illuminates on a melting quartz Dove prism. The light reflected by the Dove prism is absorbed by gases for the second time and then reflected to another anti-UV fiber by a parabolic concentrator (Thorlabs MPD01M9-F01, USA). The optical path of the absorption cell is 700 mm. According to experimental data and eqn (10),<sup>18</sup> the signal-to-noise ratio of the experimental system can reach 24.955 dB at 237.5 nm.

$$\text{SNR} = 20 \lg(I_S/I_N) \quad (10)$$

The experimental gases come from Dalian Great Special Gas Co., Ltd. Nitrogen is high purity nitrogen with concentration of 99.999%, the  $\text{NO}_2$  concentration is 195.2 ppm, the  $\text{SO}_2$  concentration is 170 ppm, and this three gases can be mixed into various gases concentration to be measured. The composition ratio of mixed gases is controlled by gas distributor (SWISSGAS Sonimix7100, Switzerland) with the control accuracy of 0.5%. Four kinds of gases can be mixed by using it and nitrogen is dilution gas in which.

#### 3.2 Experimental method

During the whole experiment, the outlet pressure of the gas cylinder pressure relief valves was maintained between 1.3 kPa and 1.5 kPa that met the pressure requirements of the gas distributor for input gas. The gases flow rate flowing into the absorption cell was  $350 \text{ ml min}^{-1}$ . Spectral signal was denoted as  $I_0(\lambda)$  when the absorption cell was completely filled with pure nitrogen. Spectral signal was denoted as  $I(\lambda)$  when the absorption cell was passed into the gases to be measured. The integration time of the spectrometer was 19 ms so that collected light intensity didn't exceed the maximum value of the detector and the collected spectral signal had sufficient signal-to-noise ratio. Fifty sets of spectral signal were collected for each gas measurement. When replacing sample gas, the gases to be tested was passed into the absorption cell for 200 s to ensure that last measured gases was completely exhausted and then data collection started. The absorption spectrum of nitrogen was measured every 10 gases samples throughout the whole

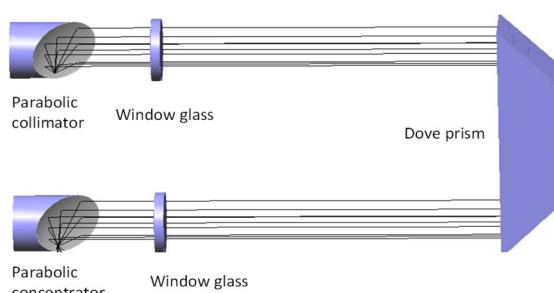


Fig. 3 The light tracing of the absorption cell.

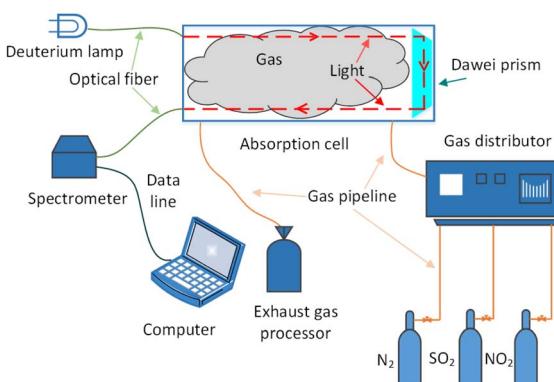


Fig. 4 The schematic diagram of the experiment.



experiment. The whole experimental procedure was performed at room temperature and atmospheric pressure. Under these conditions temperature and atmospheric pressure had little influence on the experiment results so the effect of temperature and pressure on the experimental results were ignored.

## 4. Methods and results

### 4.1 Oxygen absorption spectrum processing

During the whole experiment process, the spectrometer wasn't in vacuum or pure nitrogen environment, so spectral signal received by the spectrometer was inevitably effected by oxygen absorption in the air. However, the oxygen concentration in the air was relatively stable and wouldn't vary too much during the whole measurement process. In addition, the absorption cross-section of oxygen in measured band was smaller than the gases to be measured, so the absorption of oxygen was constant that could be removed by data processing. The detailed derivation process is as follows. The absorption of nitrogen is shown in eqn (12), and the absorption equation of  $\text{SO}_2$ ,  $\text{NO}_2$  or the mixed gases of both is shown in eqn (13). Comparing eqn (12) to (13) and then taking logarithm the result is shown in eqn (14). It shows that in the measurement process the absorption of oxygen in the air wouldn't affect measurement results.

$$I''_0(\lambda) = I_0(\lambda) \times \exp \left[ -(\sigma_{\text{O}_2}^f(\lambda) + \sigma_{\text{O}_2}^s(\lambda)) C_{\text{O}_2} L - \varepsilon_R(\lambda) - \varepsilon_M(\lambda) \right] \quad (12)$$

$$I(\lambda) = I_0(\lambda) \times \exp \left[ -\sum_{i=1}^{n-1} (\sigma_i^f(\lambda) + \sigma_i^s(\lambda)) C_i L - (\sigma_{\text{O}_2}^f(\lambda) + \sigma_{\text{O}_2}^s(\lambda)) C_{\text{O}_2} L - \varepsilon_R(\lambda) - \varepsilon_M(\lambda) \right] \quad (13)$$

$$A(\lambda) = \ln \left( \frac{I''_0(\lambda)}{I(\lambda)} \right) = \sum_{i=1}^{n-1} (\sigma_i^f(\lambda) + \sigma_i^s(\lambda)) C_i L \quad (14)$$

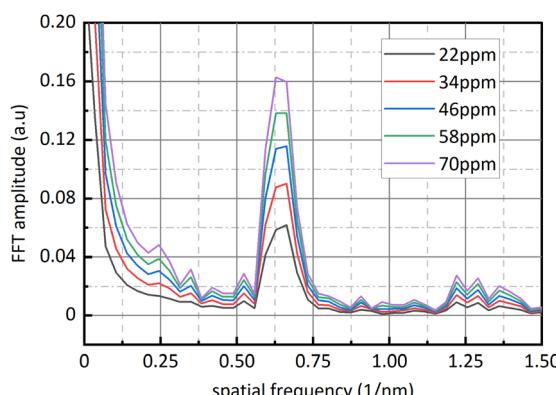


Fig. 5 The frequency spectrum of the  $\text{SO}_2$  absorbance at 193 nm–223 nm.

### 4.2 Measurement of $\text{SO}_2$ and $\text{NO}_2$

**4.2.1 Single  $\text{SO}_2$  gas measurement.** Fig. 5 shows the amplitude of  $\text{SO}_2$  absorbance after FFT at 22 ppm, 34 ppm, 46 ppm, 58 ppm and 70 ppm. It shows a significant absorption peak at  $0.628 \text{ nm}^{-1}$  and the peak value increases with the increase of  $\text{SO}_2$  concentration. The relationship between  $\text{SO}_2$  concentration and the frequency spectral amplitude at  $0.628 \text{ nm}^{-1}$  provides possibilities for  $\text{SO}_2$  concentration retrieval. Since the  $\text{SO}_2$  absorption cross-section at 193 nm–223 nm varies quasi-periodically with wavelength rather than periodically, the frequency spectrum distribution of  $\text{SO}_2$  absorbance after FFT has limited bandwidth. The amplitude at  $0.628 \text{ nm}^{-1}$  of  $\text{SO}_2$  absorbance after FFT was analyzed for correlation with the  $\text{SO}_2$  concentration which ranges from 22 ppm to 74 ppm at intervals of 4 ppm. The analysis results are shown in Fig. 6. The correlation coefficient between the amplitude at  $0.628 \text{ nm}^{-1}$  and the  $\text{SO}_2$  gas the actual concentration reaches 0.999. Combined with Fig. 5, the amplitude at  $0.628 \text{ nm}^{-1}$  has both better correlation with  $\text{SO}_2$  concentration and higher sensitivity, so it applies to the concentration retrieval of  $\text{SO}_2$ . The amplitude at  $0.628 \text{ nm}^{-1}$  and the  $\text{SO}_2$  concentration were fitted to eqn (1). Where  $\text{AMP}_{\text{SO}_2}$  is the peak value at  $0.628 \text{ nm}^{-1}$  of  $\text{SO}_2$  gas and  $C_{\text{SO}_2}$  is the retrieval concentration of  $\text{SO}_2$ .

$$C_{\text{SO}_2} = 564.783 \times \text{AMP}_{\text{SO}_2} - 18.2009 \quad (15)$$

The retrieval results of  $\text{SO}_2$  are shown in Fig. 7. Fig. 7(a) shows the deviation between the retrieval concentration and the actual concentration. The minimum value is  $-1.308 \text{ ppm}$  when  $\text{SO}_2$  actual concentration is  $54 \text{ ppm}$  in Fig. 7(a). Fig. 7(b) shows the relative deviation between the retrieval concentration and the actual concentration. It shows that there is a good linear relationship between the peak value at  $0.628 \text{ nm}^{-1}$  of  $\text{SO}_2$  absorbance after FFT and actual concentration. Its goodness of fit reaches 0.9982 which was conducive to accurate concentration retrieval.

**4.2.2 Single  $\text{NO}_2$  gas measurement.** Fig. 8 is the amplitude of  $\text{NO}_2$  absorbance after FFT from 28 ppm to 88 ppm at intervals of 12 ppm. It has an absorption peak at  $0.284 \text{ nm}^{-1}$  and the

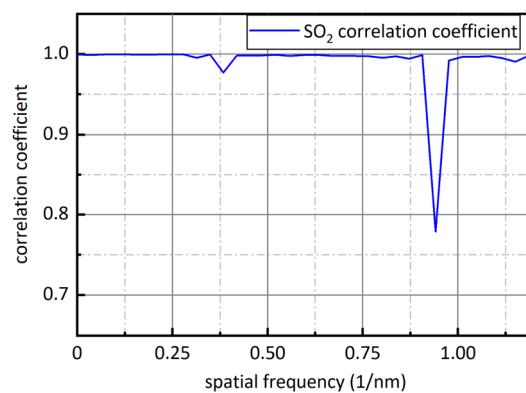


Fig. 6 The correlation analysis between  $\text{SO}_2$  concentration and FFT amplitude.



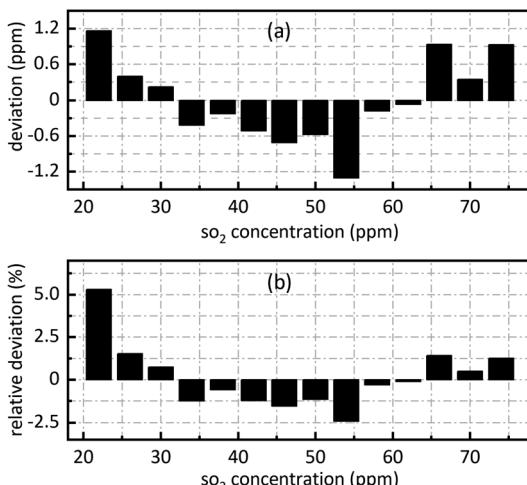


Fig. 7 SO<sub>2</sub> concentration retrieval results (a) deviation (b) relative deviation.

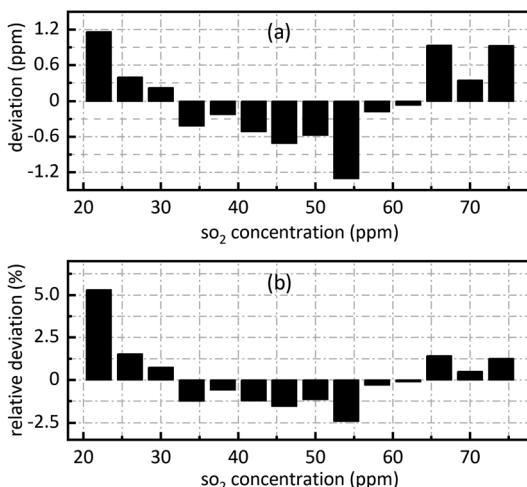


Fig. 8 The frequency spectrum of the NO<sub>2</sub> absorbance at 228 nm–253 nm.

amplitude at 0.284 nm<sup>-1</sup> increase with the increase of NO<sub>2</sub> concentration in Fig. 8. At the same time, it can also be found in Fig. 8 that the frequency spectrum amplitude of NO<sub>2</sub> absorbance after FFT is smaller than that of SO<sub>2</sub> due to the absorption cross-section of NO<sub>2</sub> varying quasi-periodically with wavelength is smaller than that of SO<sub>2</sub>. At 193 nm–253 nm, the SO<sub>2</sub> maximum absorption cross-section is approximately fifty times of that of NO<sub>2</sub>.

Fig. 9 is sixteen groups NO<sub>2</sub> samples correlation analysis between the amplitude at 0.284 nm<sup>-1</sup> of NO<sub>2</sub> absorbance after FFT and NO<sub>2</sub> concentration ranging from 28 ppm to 88 ppm at 4 ppm intervals. Their correlation coefficient reaches 0.998. It shows that there is a strong linear relationship between NO<sub>2</sub> concentration and the amplitude at 0.284 nm<sup>-1</sup>, and NO<sub>2</sub> concentration can be retrieved according to the amplitude at 0.284 nm<sup>-1</sup>. The fit relationship between the peak value at 0.284 nm<sup>-1</sup> and the NO<sub>2</sub> concentration is eqn (16).

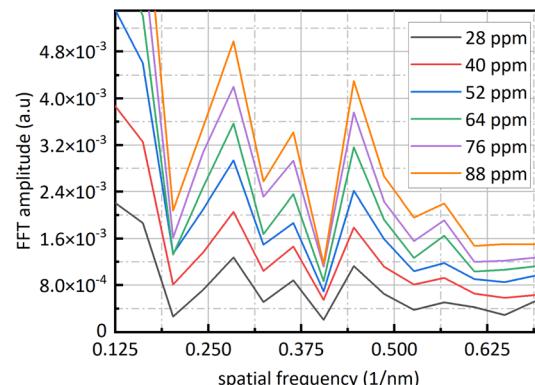


Fig. 9 The correlation analysis between NO<sub>2</sub> concentration and FFT amplitude.

$$C_{\text{NO}_2} = 16588.192 \times \text{AMP}_{\text{NO}_2} + 5.543 \quad (16)$$

where AMP<sub>NO<sub>2</sub></sub> is the amplitude at 0.284 nm<sup>-1</sup> of NO<sub>2</sub> absorbance after FFT, and C<sub>NO<sub>2</sub></sub> is the retrieval concentration. Its goodness of fit reaches 0.996. Fig. 10 shows the concentration retrieval results of NO<sub>2</sub> ranging from 28 ppm to 88 ppm at 4 ppm intervals. Fig. 10(a) shows the deviation between the retrieval concentration and the actual concentration. The maximum value of the deviation is 2.281 ppm when NO<sub>2</sub> actual concentration is 72 ppm. Fig. 10(b) shows the relative deviation between the retrieval concentration and the actual concentration. It can be seen in Fig. 10 that in the measured concentration range, the retrieval concentration deviation of NO<sub>2</sub> is slightly larger than that of SO<sub>2</sub> because the absorption cross-section of NO<sub>2</sub> is smaller than that of SO<sub>2</sub>, and the spectral signal of NO<sub>2</sub> is susceptible to noise interference.

**4.2.3 SO<sub>2</sub> measurement in NO<sub>2</sub> and SO<sub>2</sub> gases mixture.** Just like the data processing process of single gas, the retrieval band of SO<sub>2</sub> is still 193 nm–223 nm, and the retrieval band of NO<sub>2</sub> is still 228 nm–253 nm. Define the relative deviation of mixed

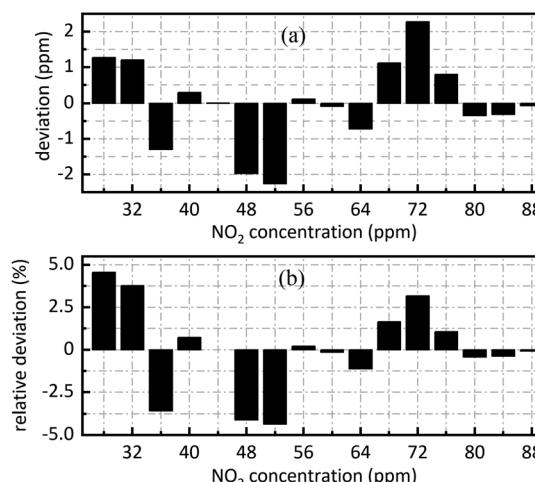


Fig. 10 NO<sub>2</sub> concentration retrieval results (a) deviation (b) relative deviation.



gases such as eqn (17).  $C_M$ ,  $C_S$  are retrieval concentration and actual concentration respectively.

$$\delta = \frac{C_S - C_M}{C_S} \times 100\% \quad (17)$$

Firstly,  $\text{NO}_2$  concentration remained unchanged and was 36 ppm, and  $\text{SO}_2$  concentration changed; secondly, both the concentration of  $\text{NO}_2$  and  $\text{SO}_2$  changed. The concentration retrieval method of the gas mixture was consistent with that of single gas. Firstly, FFT was employed for the absorbance of the mixed gases at 193 nm–223 nm and then the amplitude at 0.628 nm<sup>-1</sup> was substituted into eqn (15) to obtain  $\text{SO}_2$  concentration. The retrieval results of  $\text{SO}_2$  concentration are shown in the following Fig. 11 and 12.

The minimum relative deviation of the retrieval concentration is  $-1.471\%$  when  $\text{SO}_2$  actual concentration is 52 ppm and  $\text{NO}_2$  actual concentration is 36 ppm known in the Fig. 11 and 12. The experimental results indicate that in  $\text{NO}_2$  and  $\text{SO}_2$  mixture, the retrieval concentration of  $\text{SO}_2$  can still obtain high retrieval accuracy based on the method of FFT amplitude.

**4.2.4  $\text{NO}_2$  measurement in  $\text{NO}_2$  and  $\text{SO}_2$  gases mixture.** The concentration retrieval process of  $\text{NO}_2$  in the mixture of  $\text{NO}_2$  and  $\text{SO}_2$  likes that of single  $\text{NO}_2$  gas. Firstly, the amplitude at 0.284 nm<sup>-1</sup> was obtained by performing FFT on absorbance at 228 nm–253 nm of the mixed gases, and the concentration of  $\text{NO}_2$  gas can be obtained by substituting the amplitude at 0.284 nm<sup>-1</sup> into eqn (18). In eqn (18),  $C_{\text{NO}_2}$  is  $\text{NO}_2$  retrieval concentration, and  $\text{AMP}_{\text{NO}_2}$  is the amplitude at 0.284 nm<sup>-1</sup> of the mixed gases absorbance at 228 nm–253 nm after FFT.

$$C_{\text{NO}_2} = 20424.098 \times \text{AMP}_{\text{NO}_2} - 0.0889 \times C_{\text{SO}_2} + 7.546 \quad (18)$$

What different from eqn (16) is an extra  $\text{SO}_2$  influence coefficient in eqn (18). There are two reasons about it, on the one hand, at 228 nm–253 nm,  $\text{NO}_2$  absorption cross-section is relatively small and the spectral signal of  $\text{NO}_2$  is susceptible to that of  $\text{SO}_2$ ; on the another hand, the absorption cross-section of  $\text{SO}_2$  varies with wavelength quasi-periodically rather than periodically, so a component is present at 0.284 nm<sup>-1</sup>. In eqn

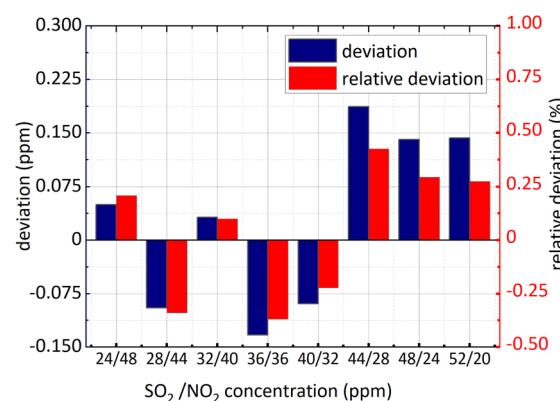


Fig. 12  $\text{SO}_2$  concentration retrieval in  $\text{NO}_2$  and  $\text{SO}_2$  gases mixture ( $\text{NO}_2$  concentration changed).

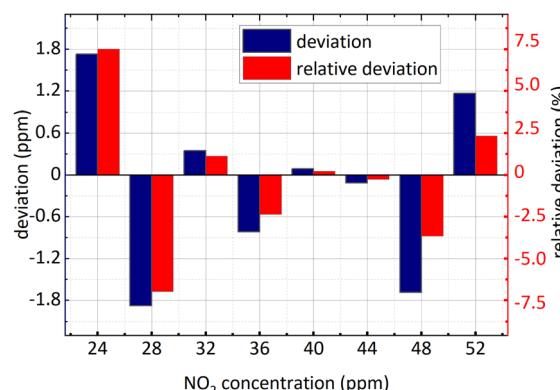


Fig. 13  $\text{NO}_2$  concentration retrieval in  $\text{SO}_2$  and  $\text{NO}_2$  gases mixture ( $\text{SO}_2$  concentration remained unchanged).

(18)  $C_{\text{SO}_2}$  represents  $\text{SO}_2$  concentration which can be obtained by eqn (15). To verify the applicability of the algorithm, kept 36 ppm  $\text{SO}_2$  concentration unchanged firstly,  $\text{NO}_2$  concentration changed and then the concentration of  $\text{SO}_2$  and  $\text{NO}_2$  changed simultaneously. The concentration retrieval results are shown in Fig. 13 and 14.

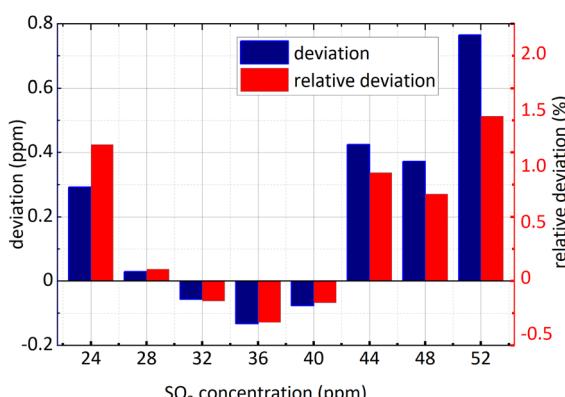


Fig. 11  $\text{SO}_2$  concentration retrieval in  $\text{NO}_2$  and  $\text{SO}_2$  gases mixture ( $\text{NO}_2$  concentration remained unchanged).

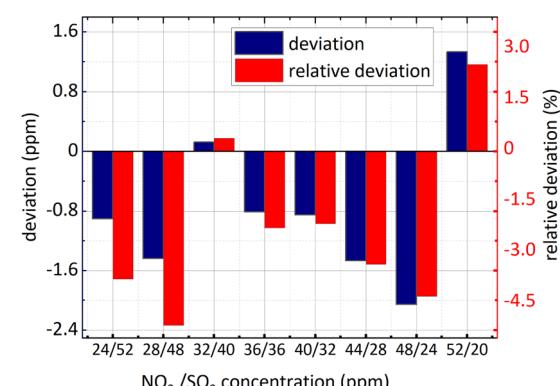


Fig. 14  $\text{NO}_2$  concentration retrieval in  $\text{SO}_2$  and  $\text{NO}_2$  gases mixture ( $\text{SO}_2$  concentration changed).

**Table 1** Comparison of SO<sub>2</sub> concentration retrieval results in mixed gases based on different methods

Method	Absorption region (nm)	Measuring range (ppm)	Relative deviation (%)	Ref.
Derivative spectra	280–320	Below 20	14–18	29
		20–80	3–7	
Iterative subtraction	206–212, 216–224	1–30	–4–1.19	1
		1–30	About –8–3.5	
FFT-IFFT	206–213	1–30	–0.424–0.370	23
FFT amplitude	193–223	24–52		This work

It is known in the Fig. 13 and the Fig. 14 that: (1) the minimum relative deviation of the retrieval results is –7.207% when NO<sub>2</sub> actual concentration is 24 ppm and SO<sub>2</sub> actual concentration is 36 ppm. (2) There is no significant difference in the retrieval deviation of NO<sub>2</sub>, whether SO<sub>2</sub> concentration changed or not. It shows that the concentration retrieval process of NO<sub>2</sub> based on the relationship between FFT amplitude and NO<sub>2</sub> concentration can well remove the interference from SO<sub>2</sub>.

It can be seen that from the retrieval results of SO<sub>2</sub> and NO<sub>2</sub> in the mixed gases, no matter whether the concentration of interfering gas changed, the deviation of SO<sub>2</sub> concentration retrieval is significantly less than that of NO<sub>2</sub>. This is because the absorption cross-section of SO<sub>2</sub> is larger than that of NO<sub>2</sub>, so the high signal-to-noise ratio of SO<sub>2</sub> absorption spectrum can be obtained. It is clear that SO<sub>2</sub> is more suitable than NO<sub>2</sub> for gas concentration retrieval based on the method of FFT amplitude.

#### 4.3 Comparison with the retrieval results of other methods

SO<sub>2</sub> is gas that is widely studied based on DOAS principle. Therefore, SO<sub>2</sub> in mixed gases is used to compare the concentration retrieval deviation by using different separation methods of superposed spectra. As shown in Table 1, using the amplitude of absorbance after FFT and selecting appropriate retrieval band have higher retrieval accuracy than using the iterative subtraction filter at 206 nm–213 nm and the FFT-IFF method at 280 nm–320 nm.

## 5. Conclusions

In this paper, in hardware, the homemade gas absorption cell was used. In algorithm, FFT was used to transfer the absorbance of SO<sub>2</sub>, NO<sub>2</sub> or the mixture of both from wavelength domain to frequency domain, and gas concentration was retrieved based on the relationship between the amplitude of absorbance after FFT of the gas to be measured and gas actual concentration. The experimental results show that the relative deviation absolute value of the retrieval concentration of single SO<sub>2</sub> gas is less than 5.307%, that of single NO<sub>2</sub> gas is less than 4.553%, that of SO<sub>2</sub> in NO<sub>2</sub> and SO<sub>2</sub> gases mixture is less than 1.471%, and that of NO<sub>2</sub> in NO<sub>2</sub> and SO<sub>2</sub> gases mixture is less than 7.207%.

It can be seen that using the amplitude of absorbance after FFT of SO<sub>2</sub>, NO<sub>2</sub> or the mixture of both and selecting appropriate retrieval band to retrieve gas concentration has higher detection accuracy than other methods. Regarding that the frequency resolution after FFT relates to spectrum numbers that

was collected in study band, more spectrum numbers more high frequency resolution, the detection precision can be further improved by higher resolution spectrometer. In addition more longer absorption cell can also improve detection precision.

This paper fully utilizes the large absorption cross-section of NO<sub>2</sub> and SO<sub>2</sub> and their quasi-periodic variation with wavelength at 193 nm–253 nm, making it possible to detect the low concentration mixed gases of NO<sub>2</sub> and SO<sub>2</sub>. Simultaneously, it also provides a feasible method for future research on high-precision detection of more types of mixed gases in ultraviolet band, such as gas mixture of NO<sub>2</sub>, SO<sub>2</sub>, NO in flue gas.

## Author contributions

Yibiao Yang: conceptualization, methodology, software, investigation, writing-original draft, data curation. Jianing Wang: formal analysis, writing – review & editing and visualization. Zihui Zhang: validation, resources and supervision. Guanyu Lin: project administration and funding acquisition.

## Conflicts of interest

There are no conflicts to declare.

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