



## Qualitative Detection Toward Military and Improvised Explosive Vapors by a Facile TiO<sub>2</sub> Nanosheet-Based Chemiresistive Sensor Array

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Li Y, Zhou W, Zu B and Dou X (2020) Qualitative Detection Toward Military and Improvised Explosive Vapors by a Facile TiO<sub>2</sub> Nanosheet-Based Chemiresistive Sensor Array. Front. Chem. 8:29. doi: 10.3389/fchem.2020.00029 A facile TiO<sub>2</sub> nanosheets-based chemiresistive gas sensor array was prepared to identify 11 kinds of military and improvised explosive vapors at room temperature. The morphology of TiO<sub>2</sub> nanosheets was well-controlled by adjusting the concentration of HF applied during the preparation. Owing to the morphology difference, the TiO<sub>2</sub> nanosheet-based sensors show different response values toward 11 kinds of explosives, which is the basis of the successful discriminative identification. This method owes lots of advantages over other detection techniques, such as the facile preparation procedure, high response value (115.6% for TNT and 830% for PNT) at room temperature, rapid identifying properties (within 30 s for 9 explosives), simple operation, high anti-interference property, and low probability of misinforming, and consequently has a huge potential application in the qualitative detection of explosives.

Keywords: TiO<sub>2</sub>, chemiresistive sensor array, military explosives, improvised explosives, vapor detection

### INTRODUCTION

Rapid and accurate detection of explosives has been a hot issue of global concern due to the deepening terrorism crisis (Chen et al., 2010; Lichtenstein et al., 2014; Yang et al., 2015; Guo et al., 2017; Bastatas et al., 2018; Liu et al., 2019). The illegal blast induced by terrorists applied not only the powerful military explosives, but also the less powerful improvised explosives made of commercial available chemicals. Military explosives, mainly referred to nitro-explosives, such as 2,4,6-trinitrotoluene (TNT), dinitrotoluene (DNT), hexogen (RDX), and so on. The sensitive, selective, and rapid detection of nitro-explosive vapors is still a challenge owing to their low vapor pressures at room temperature. For instance, the room temperature saturated vapor pressures of TNT, DNT, para-nitro toluene (PNT), picric acid (PA), RDX are 9 ppb (part per billion), 180 ppb, 647 ppb, 0.97 ppb, and 4.9 ppt (part per trillion), respectively (Ewing et al., 2013). During the past decade, several techniques have been applied for the detection of military explosive vapors, such as fluorescence (Andrew and Swager, 2007; He et al., 2009; Olley et al., 2010; Zhu et al., 2011), surface enhanced Raman scattering (SERS) (Yang et al., 2010; Wang et al., 2014), ion mobility spectrometer (IMS) (Zhou et al., 2015), and chemiresistive sensors (Che et al., 2010; Chen et al., 2010; Engel et al., 2010; Wang et al., 2011a; Aluri et al., 2013). However, most of the previous reports were unable to realize the identification of different kinds of military explosives

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(Andrew and Swager, 2007; He et al., 2009; Che et al., 2010; Chen et al., 2010; Engel et al., 2010; Olley et al., 2010; Wang et al., 2011a; Zhu et al., 2011; Aluri et al., 2013; Zhou et al., 2015). Moreover, some of the reported techniques suffer from the extremely low response at room temperature (Chen et al., 2010; Aluri et al., 2013) and time consuming problem (Hutchinson et al., 2007; Zhu et al., 2011), inhabiting their application in the rapid on-the-spot detection of military explosives.

Different from the relative mature development of military explosive vapors detection, the detection of improvised explosives barely got any attention due to their ultra-low vapor pressure even at the typical maximum desorber temperature (Steinfeld and Wormhoudt, 1998; Mäkinen et al., 2011; Najarro et al., 2012; Peng et al., 2014). Improvised explosives are generally made of non-explosive compounds including KClO<sub>3</sub>, KNO<sub>3</sub>, KMnO<sub>4</sub>, S, NH<sub>4</sub>NO<sub>3</sub>, and urea (Kuila et al., 2006; Peters et al., 2015), via simple reaction or just blending, and are extensively used in terrorist attacks owing to their readily availability and low cost. Some techniques have been utilized for the detection of improvised explosives, such as capillary electrophoresis (CE) (Hutchinson et al., 2007; Blanco et al., 2011), ion chromatography (IC) (Dicinoski et al., 2006; Meng et al., 2008), and electrospray ionization mass spectrometry (ESIMS) (Zhao and Yinon, 2002; Flanigan et al., 2011). However, their drawbacks limited their application in the rapid identification of improvised explosives. For example, CE and IC need about 10 min to identify various kinds of anions and cations (Hutchinson et al., 2007; Johns et al., 2008), while ESIMS requires large equipment and therefore results in high testing expense and difficulties in on-the-spot application. Ionization mass spectrometry (IMS) has been proved to be an efficient technique for on-the-spot detection of trace improvised explosives such as KNO3, KClO3, and KClO<sub>4</sub> within 5s (Peng et al., 2014). However, it involves a time-consuming pretreatment procedure including sample swap and acidification. Therefore, a method to identify improvised explosives in a simple, fast, and low energy consuming manner is urgently needed.

Nanomaterial-based chemiresistive-gas sensor is an important explosives detection method due to the small device size, low energy consumption, high and rapid response (Senesac and Thundat, 2008; Che et al., 2010; Chen et al., 2010; Engel et al., 2010; Zu et al., 2013; Guo et al., 2014). For the detection of the military explosives, such as TNT, DNT, and RDX, several nanostructures have been explored as the sensing components, including TiO<sub>2</sub>(B) nanowires (Wang et al., 2011a), GaN/TiO<sub>2</sub> heterostructure (Aluri et al., 2013), organic nanoribbons (Che et al., 2010), carbon nanotubes and ZnO nanowires (Chen et al., 2010). Moreover, nanostructured materials, such as  $Mn^{2+}$ -doped ZnS nanocrystal, Fe-doped ZnO nanomaterial, and Aphendoped TiO<sub>2</sub> nanocrystal, have also been proved to be efficient for the gas sensing of improvised explosives (Qu et al., 2016; Wu et al., 2016; Xie and Liu, 2019). However, these chemiresistors can only detect a few explosive vapors, and the response values are as low as 5% at room-temperature (Chen et al., 2010; Aluri et al., 2013), leading to the increased possibility of misinforming.

In order to avoid the interference of other similar gases and decrease the misinformation, the chemically modified singlewalled carbon nanotube (SWCNT) -based (Schnorr et al., 2013; Liu et al., 2015) and Si nanowire-based (Lichtenstein et al., 2014) nanosensor array were prepared to discriminatively identify different vapors. However, it is confirmed that the covalent functionalization of the SWCNTs can disrupt the extended electronic states and thus increase the base resistance, which may lower the sensitivity (Schnorr et al., 2013). Although quality sensors can be obtained by modest degree of functionalization, the experiment procedure is rather complicated (Bekyarova et al., 2010; Schnorr et al., 2013). In addition, the chemically modified selectors may increase the contact distance due to the existence of the functionalized molecular chains between analytes and the sensing materials, which may lower the sensor sensitivity. Nanostructured TiO2 is proved to be an efficient sensing material toward nitro-explosives detection (Wang et al., 2011a,b, 2013; Aluri et al., 2013; Tao et al., 2013; Yang et al., 2015). While doping with Apen, the  $TiO_2$  nanocrystal is applied for the detection of limited number of military and improvised explosives under UV-light illustration, including TNT, DNT, PA, S, AN, and TATP (Xie and Liu, 2019). However, the application of undoped TiO<sub>2</sub> nanomaterials in the detection of improvised explosives remains unexplored. To the best of our knowledge, the morphology of nanomaterials has significant impact on their gas sensing performance since the geometric morphology difference can cause different specific surface area and the change in electron depletion layer (Gurlo, 2011; Cho et al., 2013). Hence, gas sensory array based on MoS2/RGO composites with various morphologies has been constructed for the recognitive detection of Triacetone Triperoxide (TATP) precursors (Sun et al., 2019). Furthermore, utilizing the fluorine as the capping agent for exposure facets stabilization, the morphology of TiO<sub>2</sub> nanomaterials with treatment could be well tailored by modulating the synthesis parameters, including F sources, the concentration of the source, reaction temperature and time, and so on (Lee et al., 2016; Yan et al., 2017; Zhao et al., 2017). However, there is no attempt on the construction of gas sensor array based on nanostructured TiO<sub>2</sub> with different morphologies to realize the discrimination of various explosives.

In this work, a series of  $TiO_2$  nanosheets with different morphologies were successfully prepared via the hydrothermal reaction with the help of F<sup>-</sup>. The gas sensor array with these  $TiO_2$ nanosheets as the sensing components can identify the 5 nitroexplosive vapors (TNT, DNT, PNT, RDX, PA) and 6 improvised explosive vapors (including KNO<sub>3</sub>, KClO<sub>3</sub>, KMnO<sub>4</sub>, S, NH<sub>4</sub>NO<sub>3</sub>, urea) successfully.

### MATERIALS AND METHODS

### Chemicals

Tetrabutyl orthotitanate (TBOT), concentrated sulfuric acid (H<sub>2</sub>SO<sub>4</sub>, 98%), hydrofluoric acid (HF, 40%), 2,4-dinitrotoluene (DNT), *p*-nitrotoluene (PNT), picric acid (PA), potassium nitrate (KNO<sub>3</sub>), potassium chloride (KClO<sub>3</sub>), potassium permagnate (KMnO<sub>4</sub>), sulfur (S), ammonium nitrate (NH<sub>4</sub>NO<sub>3</sub>), and urea were purchased from Sigma-Aldrich. 2,4,6-trinitrotoluene (TNT)

and hexogen (RDX) were obtained from the National Security Department of China. Except for TNT was recrystallized with ethanol before use, all other chemicals were of analytical grade and used without further purification.

### Caution

TNT and other nitro-explosives used in the present study are highly explosive and should be handled only in small quantities.

### Preparation of TiO<sub>2</sub> Nanosheets

The TiO<sub>2</sub> nanosheets were prepared via a hydrothermal method. In a typical procedure, different amounts of HF (0–1 ml) were added to the mixture of 12.5 ml TBOT and 1.5 ml H<sub>2</sub>SO<sub>4</sub> with vigorous stirring, followed by the addition of certain amount of H<sub>2</sub>O to maintain the total volume of the reaction mixture as 15 ml. The mixture was then transferred to Teflon lined autoclave and kept at 180 °C for 24 h. After completion of the reaction, the white precipitate was filtered and washed with ethanol several times and then dried in air at 60 °C.

### Characterization

X-ray diffraction (XRD) measurement was conducted using powder XRD (Bruker D8 Advance, with Cu-K<sub> $\alpha$ </sub> radiation operating at 40 kV and 40 mA, scanning from 2 $\theta$  = 10 to 90°). Field-emission scanning electron microscopy (FESEM, ZEISS SUPRA 55VP), and transmission electron microscope (JEM-2011 TEM, 200 kV) were used to characterize the morphology and the detailed structure of the samples.

# Sensor Array Fabrication and Gas Sensing Performance Testing

The obtained TiO<sub>2</sub> nanosheets were mixed with deionized water in a weight ratio of 4:1 and ground in a mortar for 10 min to form a uniform paste. The paste was then coated on a ceramic substrate, on which silver interdigitated electrodes with both finger-width and inter-finger spacing of about 200 µm was previously printed, by a thin brush to construct a gas sensor. The thickness of the film was controlled by the brushed cycles. The sample was dried naturally in air overnight and aged at 10 V in air to ensure the good stability. Five gas sensors from  $\mathrm{TiO}_2$  with different morphologies were fabricated together to construct the sensor array. The room temperature-saturated explosive vapor was obtained by putting solid explosive powder (1g) at the bottom of a conical flask (50 mL) before it was sealed for 48 h. All tests were performed at consistent operating temperature (room temperature,  $25 \pm 2^{\circ}$ C) and relative humidity (30 ± 3%) to avoid undesired signal fluctuate. For gas sensing test, the sensor was inserted into the saturated vapor of an explosive. After the sensor resistance reached a new constant value, the sensor was then inserted into a same size conical flask full of air to recover. The electric signal (current) of the sensor was recorded by electrochemical workstation (CIMPS-2, ZAHNER). The essential gas sensing characteristics, namely the corresponding response value, response time and recovery time, can be obtained from the response curves. The response value is the steady-state value of the response with exposure toward explosive vapors, and is defined as,

$$\text{Response} = \frac{I_g - I_a}{I_a} * 100\% \tag{1}$$

where  $I_g$  and  $I_a$  are the current value of the gas sensor measured in explosive vapor and in air at room temperature, respectively. The response time is defined as the period it takes to cause 90% of the current changes upon exposure to the explosive vapor, while the recovery time is defined as the period it takes to cause 90% of the current changes after the explosive vapor is removed.

### **RESULTS AND DISCUSSION**

### Morphology Tailoring of TiO<sub>2</sub> Nanosheets

X-ray diffraction (XRD) analysis was performed to investigate the crystal phase of the TiO<sub>2</sub> nanosheets prepared by adjusting the amounts of HF solution (0-1.0 ml) applied in the hydrothermal reaction. As shown in Figure 1A, it is obvious that all the diffraction peaks of TiO<sub>2</sub> nanosheets prepared via this method can be well-indexed as the anatase TiO<sub>2</sub> phase (JCPDS NO. 21-1272), demonstrating that the phase of the  $TiO_2$  nanosheets would not be affected by the concentrations of HF solution within this range during the preparation. The morphology of the TiO<sub>2</sub> nanosheets was investigated by transmission electron microscopy (TEM) and field emission scanning electron microscopy (FESEM), as shown in Figures 1B-F. It is found that the morphologies are different with the increasing amount of HF applied from 0 to 1.0 ml. With the absence of HF, the TiO<sub>2</sub> nanoparticles grew randomly and form the irregular shape with size ranging from 5 to 20 nm, and there is no continuous growth of large nanosheets (Figure 1B). With the amount of HF increasing to 0.25 ml, it is observed that the TiO<sub>2</sub> crystals grew larger to form rectangular-shaped nanosheets, which consist of the smaller ones with size of 15-25 nm as major and limited number of larger nanosheets over 40 nm (Figure 1C). With the amount of HF continuously increasing to 0.50 ml, the number of relatively larger sized TiO<sub>2</sub> nanosheets (45 nm in average) increased, however, the smaller nanosheets (20 nm in average) are still the major component due to the restricted HF amount (Figure 1D). Meanwhile, it is also observed that extra-large nanosheets with size about 100 nm start to form. With the amount of HF continuously increasing to 0.75 ml, although there are still smaller nanosheets (20 nm) and larger sized TiO<sub>2</sub> nanosheets (45 nm in average) existing, the extra-large nanosheets with size around 100 nm are distinctively observed (Figure 1E). When the amount of HF further increases to 1.0 ml, the overgrowth of TiO<sub>2</sub> nanosheets occurred leading to the sheet-like structures with size of several microns (Figure 1F). Hence, with the amount of HF increasing from 0 to 1 ml, the size of TiO2 nanosheets grew from a dozen nanometers to several microns. High resolution transmission electron microscopy (HRTEM) was adopted to obtain the detailed crystal structure (insets in Figures 1B-F), clear lattice fringes with the lattice spacing corresponding to the (101) plane of anatase TiO<sub>2</sub> were shown, indicating the



FIGURE 1 | (A) XRD patterns of five kinds of TiO<sub>2</sub> nanosheets, TEM, and SEM images of the TiO<sub>2</sub> nanosheets prepared with different amounts of HF (B) 0 ml, (C 0.25 ml, (D) 0.5 ml, (E) 0.75 ml, and (F) 1 ml (insets are HRTEM images).

good crystallinity of the samples. As a whole, the increased HF content in the original reaction mixture promotes the growth of the anatase  $TiO_2$  nanosheets with more reactive facets beneficial for sensing due to the enlarged capping effect. This phenomenon is in good agreement with the previously reported results, in which the growth behavior of  $TiO_2$  with various contents of F<sup>-</sup> is systematically studies (Lee et al., 2016). Therefore, the introduction of F<sup>-</sup> ion during the preparation is a reasonable choice to control the growth, tailor the morphology, and thus adjust the sensing performance of anatase  $TiO_2$  nanosheets.

## Varying Sensing Performance Toward Military and Improvised Explosive Vapors

The as-prepared  $TiO_2$  nanosheets with different morphologies were fabricated on ceramic substrate with comb-like electrodes, respectively, to construct a chemiresistive gas sensor array, as schematically shown in **Figure 2A**. The obtained sensor array was exposed to five saturated military explosive vapors (TNT, DNT, PNT, RDX, PA) and six saturated improvised explosive vapors (KNO<sub>3</sub>, KClO<sub>3</sub>, KMnO<sub>4</sub>, S, NH<sub>4</sub>NO<sub>3</sub>, urea) at roomtemperature for evaluation of the sensing properties (Figure 2B). The room-temperature saturated vapor pressures of all these analytes are extremely low, such as 9 ppb for TNT, 411 ppb for DNT, 647 ppb for PNT, 0.97 ppb for PA, 4.9 ppt for RDX, 2 ppb for S, 9 ppt for urea, and 14.7 ppb for NH<sub>4</sub>NO<sub>3</sub> (Lyons, 2011; Ewing et al., 2013). Meanwhile, the other three explosives, KNO<sub>3</sub>, KClO<sub>3</sub>, and KMnO<sub>4</sub>, owing to their ionic crystal nature, are non-volatile and hard to decompose at room temperature indicating that neither the vapor of themselves nor their decomposition products is responsible for the gas sensing signal (Supplementary Table 1) However, it has been discovered that microparticulates could be separated from nonvolatile solids and suspended in air (Clark and Shirley, 1973; Samet et al., 2004; Li et al., 2018; Yao et al., 2018). Therefore, we believe that the microparticulates suspended in the vapor



of these explosives, which could interact with the surface of sensing materials and hence are responsible for the electric signal changes of the sensors in the array. The response curves are generated from the current change traces of the sensors toward explosive vapors at an applied voltage of 10 V. From the current change behaviors (Supplementary Figures 1-10), it is obvious that with the immersing of the sensor array into explosive vapors, the resistances change immediately, and then with the immersing of the sensor array into air, the resistance change back to its initial value rapidly, indicating the good repeatability of the sensor array toward each explosive vapor. It is also observed that each sensor in the array shows different resistance change with exposure to different kinds of explosive vapors. While with immersion into the same explosive vapor, the sensors in the array show different resistance change as well. It is believed that the resistance change of the TiO<sub>2</sub> nanosheets sensing materials was caused by the change of the charge depletion layer depth. For a single sensor in the array exposed to various explosive vapors, the different gas molecules adsorbed on the surface of TiO<sub>2</sub> nanosheets would lead to different surface potential barrier, which depends on

the charge density established upon interaction between the adsorbed target gas and active sites on the surface of the sensing layer. Thus, different charge depletion layer depth would be resulted and hence the difference in resistance was observed. Furthermore, the differences in response among all sensors in the array toward the same explosive vapor are caused by the different charge depletion layer depth introduced by morphology tailoring. The modulation of sensing performance by morphology tailoring could be attribute to the capping effect of F<sup>-</sup> ion. It is observed that the response of the TiO<sub>2</sub> nanosheets toward certain explosive vapor generally increased first and then decrease with the increasing amount of F<sup>-</sup> ion. On one hand, since the  $F^-$  ion serves as the capping agent for stabilizing reactive facets (Lee et al., 2016), with the increasing amount of F<sup>-</sup> ion, more reactive facets are exposed for sensing, resulting in the enhanced sensing performance. While on the other hand, with the increasing amount of F<sup>-</sup> ion, the TiO<sub>2</sub> nanosheet crystals grow larger, leading to a reduced charge depletion layer depth which is hindering the sensing performance enhancement. However, due to the extreme complicated gas sensing response process, the responses could be affected by



many factors, including the interaction between the analyte and the sensing material, decomposition products, the humidity change caused by the analyte and the floating tiny clusters of the analyte (**Supplementary Table 1**), and hence they are not strictly in line with the changing trend. Therefore, the sensing performance of  $TiO_2$  nanosheets toward explosive vapors could be modulated by morphology tailoring.

The response values of the sensor array toward 5 kinds of military explosive vapors and 6 kinds of improvised explosive vapors are summarized from the response curves (Figure 3). It is clearly shown that all 5 gas sensors consisted in the array can detect 11 kinds of explosive vapors yielding different response values. For military explosives detection (Figure 3A), such as, toward TNT and PNT vapors, sensor 2 (0.25 HF) shows the largest responses of 115.6 and 830.0%, respectively. Sensor 3 (0.5 HF) shows the largest response value (65.0%) toward DNT. Toward RDX, sensor 1 (0 HF) shows the largest response of 40.0%. Sensor 4 (0.75 HF) shows the largest response value of 115.0% toward PA. Toward improvised explosives, the TiO<sub>2</sub> nanosheet-based gas sensor array also show excellent gas sensing performance (Figure 3B). Sensor 3 (0.5 HF) exhibits the largest responses toward KNO<sub>3</sub>, KMnO<sub>4</sub> and S, while the corresponding values are 56.3, 140.5, and 156.8%, respectively. Sensor 1 (0 HF) exhibits the largest response of 96.2% toward KClO<sub>3</sub>. Toward NH<sub>4</sub>NO<sub>3</sub> and urea, all sensors show strikingly large responses, and sensor 4 (0.75 HF) exhibits the largest responses of 255.6 and 1783.1 times, respectively. To sum up, TiO<sub>2</sub> nanosheets with different morphologies show different response values toward nitro- and improvised explosive vapors, which further indicates that the sensing performance of  $TiO_2$ nanosheets can be well-regulated to achieve the response differences by simply controlling the morphology. Furthermore, it should be noted that the TiO2 nanosheet-based sensor array can work in a very large response range, from zero to a few thousands, which would enhance the practical application of the array.



Besides the response values, response time and recovery time of the gas sensor array toward 11 explosive vapors are also summarized (**Figure 4**). Toward TNT, PNT, RDX, PA, KNO<sub>3</sub>, KClO<sub>3</sub>, and S, sensor 5 (1 HF) shows the fastest response with response times of 10.7, 12.3, 1.3, 8.3, 7.7, 11.7, and 8.3s, respectively (**Figure 4A**). Meanwhile, toward DNT, KMnO<sub>4</sub>, and NH<sub>4</sub>NO<sub>3</sub>, sensor 1 (0 HF) shows the fastest response, and the corresponding response times are 11.0, 9.7, and 16.3 s, respectively. It should be noted that the response time of sensor 2 (0.25 HF) toward urea is only 25.3 s although the response value is as high as 399.5. The response time periods are within 30 s for most of the explosive vapors.

Similar as the response time, the recovery time of sensors in the array are also different resulting from the morphology differences of TiO<sub>2</sub> nanosheets (**Figure 4B**). Toward TNT, DNT, PNT, KNO<sub>3</sub>, KClO<sub>3</sub>, KMnO<sub>4</sub>, and S, sensor 1 (0 HF) shows the fastest recovery, and the corresponding recovery times are 3.3, 9.7, 3.7, 9.7, 8.0, 6.3, and 9.7 s, respectively. Toward RDX, PA, NH<sub>4</sub>NO<sub>3</sub>, and urea, sensor 5 (1 HF) shows the fastest recovery with recovery times of 1.0, 6.0, 3.3, and 2.3 s, respectively. As a whole, the TiO<sub>2</sub> nanosheet-based gas sensor array can recover to its initial state within 35 s in atmosphere, indicating that it can be employed for the next detection cycle rapidly.

The anti-interfering performance of the sensor array is evaluated by exposing the sensor array to common interfering gases, namely ethanol (EtOH), NO<sub>2</sub>, and NH<sub>3</sub>, with concentration of 1 ppm (Figure 5; Supplementary Figures 11–15). All 5 gas sensors in the array exhibit positive response toward EtOH and NO2 gases and negative response toward NH<sub>3</sub> (Figure 5A), which is in good agreement with results discussed above. It is worth to notice that the currents of the TiO2 nanosheets based sensors increase in typical electron withdrawing target vapors, such as TNT,



DNT, and NO<sub>2</sub>, which is rare and under further exploration. The response values toward EtOH and NO2 are much smaller compared with that of explosive vapors. For instance, sensor 3 (0.5 HF) shows the largest response of 10.6% toward EtOH, while sensor 4 (0.75 HF) shows the largest response of 6.1% toward NO<sub>2</sub> (Figure 5B). Meanwhile, in the case of NH<sub>3</sub>, the sensors in the array all shows negative response values with a largest response of -66.7%, which is relatively large but in the opposite direction compared with that of explosive vapors. The response time toward these interfering gases are all <30 s which are comparable with that of the explosive vapors (Figure 5C). Considering the fact that the room temperature vapor pressures of the explosives are much lower than 1 ppm, it can be concluded that the common interfering gases in real-world have limited influence on the sensing performance of the sensor array toward explosive vapors.

## Discriminative Recognition of Explosive Vapors

The methodology of principal component analysis (PCA), which could extract the selective feature of original data depending on variance criteria and visualize the extracted feature, was used to discriminatively recognize explosives. Its analysis procedure is schematically shown in **Figure 6A**. All responses data from the gas sensor array were subjected to PCA, and were transformed to a new coordinate system. Afterwards, each kind of explosive vapor can be represented as a point in the new three-dimensional space, such as TNT1 (x1, y1, z1). Thus, different explosives and the interfering gases appear at different positions in the new coordinate system, as shown in **Figures 6B–D**.

Based on the response difference induced by morphology difference between  $TiO_2$  nanosheets, all 11 kinds of explosives

and 3 interfering gases can be discriminatively identified except for DNT and EtOH, which are overlapping, and urea and NH<sub>4</sub>NO<sub>3</sub>, which are very close to each other (Figure 6B). If only the family of military explosives and the interfering gases are considered, the clusters of organic explosives and some of the interfering gases are scattered further from each other with the exception of DNT and EtOH (Figure 6C). Similarly, if only the family of improvised explosives and the interfering gases are of interest, the clusters of improvised explosives are also scattered further from each other, such as KNO<sub>3</sub>, KClO<sub>3</sub> KMnO<sub>4</sub>, S, NH<sub>3</sub>, NO<sub>2</sub>, and EtOH from NH<sub>4</sub>NO<sub>3</sub> and urea (Figure 6D). However, it should be noted that although the PCA analysis of responses is powerful enough to discriminate 10 explosives and 2 interfering gases, it is difficult to discriminate DNT from EtOH and urea from NH<sub>4</sub>NO<sub>3</sub> using PCA analytical method based only on the response values.

During the gas sensing procedure, the response value as a steady state parameter is associated with the thermodynamic interaction between the explosive species and the TiO<sub>2</sub> nanosheets, while the response time and recovery time are associated with the kinetic interaction between them. However, response time is a more meaningful kinetic parameter for explosives recognition in practical detecting situation since fast responding is essential to achieve early alarming. Therefore, by combining the rapid mathematical analysis of the thermodynamic and kinetic interactions, namely the response value and response time, a visible fingerprinting method is utilized to realize the discriminative identification of explosives. This fingerprinting method is suitable for discriminative identification as the shape of the fingerprinting pattern is independent with the analyte concentration (Lichtenstein et al., 2014). Figure 7 shows the fingerprinting radar plot patterns of





all explosive vapors and 3 interfering gases generated from the response values and response times of the sensors in the array. It is obvious that each analyte has its unique fingerprinting pattern, which can be used to distinguish from each other and thus to realize the discriminative identification of all the analytes including not only the explosives but also the interfering gases (Figures 7A-G). For instance, TNT, DNT, and PNT exhibit different patterns although they have similar molecular structures. Meanwhile, although KNO3 and KClO3 are both potassium salts, their radar plot patterns distinguish from each other. This distinction should be ascribed to the different interactions between different explosive vapors and TiO<sub>2</sub> nanosheets with different morphologies. In the case of NH<sub>4</sub>NO<sub>3</sub> and urea, which are hard to be discriminated using PCA method, they can be differentiated from each other easily owing to their remarkably different radar plot patterns. While for DNT and EtOH, which are unable to be distinguish in the PCA plot, the radar plot patterns are of great difference and thus it is also easy to discriminate them from each other using this method. Therefore, with straightforward data analysis, the chemiresistive sensor array from  $TiO_2$  nanosheets with different morphologies is capable of discriminatively identifying 11 types of explosive vapors and 3 common interfering gases.

Furthermore, the present chemiresistive gas sensor array has lots of advantages for practical application. Compared with other vapor electrical sensors (Che et al., 2010; Chen et al., 2010; Wang et al., 2011a; Aluri et al., 2013; Schnorr et al., 2013; Liu et al., 2015; Yang et al., 2015), it shows a higher sensitivity toward TNT, DNT, and PNT, and can detect RDX vapor at ppt level (**Supplementary Table 2**). Compared with other military explosive detecting techniques (Andrew and Swager, 2007; He et al., 2009; Olley et al., 2010; Zhu et al., 2011; Wang et al., 2014; Zhou et al., 2015), it can identify 5 military explosives within 30 s and avoid (1) the interference induced by other



FIGURE 7 | Radar plots of response values and response times of 11 explosives and 3 interfering gases: (A) TNT, DNT, and PNT; (B) RDX and PA; (C) KNO<sub>3</sub> and KCIO<sub>3</sub>; (D) KMnO<sub>4</sub> and S; (E) NH<sub>4</sub>NO<sub>3</sub> and urea; (F) EtOH and NH<sub>3</sub>; (G) NO<sub>2</sub>. Left side response value represents the thermodynamically derived results for each analyte, and the right side response time represents the kinetically derived results for each analyte.

substances, (2) the large and expensive instrumentation, and (3) complicated operating procedure, which might be problematic for fluorescence, SERS, and IMS (**Supplementary Table 3**). In the case of detection of improvised explosives, the present gas sensor array can discriminatively identify 6 improvised explosive vapors within 75 s, which is much more efficient compared with CE and IC (**Supplementary Table 4**; Hutchinson et al., 2007; Peng et al., 2014). Moreover, it can avoid complicated operation which is essential in IMS technique (Johns et al., 2008). Therefore, the present TiO<sub>2</sub> nanosheet-based chemiresistive gas sensor array shows high sensitivity, short testing time, handy operation, and the ability to avoid interference, which are beneficial for practical application in rapid identification of military and improvised explosives.

### CONCLUSIONS

A series of TiO<sub>2</sub> nanosheets with well-tailored morphologies were successfully prepared via a simple hydrothermal method. HF was utilized as morphology modulation agent in the reaction. The size of the TiO2 nanosheets grew larger with the increase of the amount of HF. The morphological difference of TiO<sub>2</sub> nanosheets leads to the dissimilarity of the specific surface area and the charge depletion layer depth, and hence different responses toward explosive vapors. The gas sensor array based on the series of TiO2 nanosheets can rapidly and discriminatively identify the vapors of 5 nitro-explosives (TNT, DNT, PNT, RDX, PA) and 6 improvised explosives (KNO<sub>3</sub>, KClO<sub>3</sub>, KMnO<sub>4</sub>, S, NH<sub>4</sub>NO<sub>3</sub>, urea) along with 3 common interfering gases (EtOH, NO2, NH3) successfully under roomtemperature condition with the help of PCA and fingerprinting pattern recognition method. It has a huge potential for practical application owing to its obviously superior advantages compared with other detection techniques. Thus, this work presents an

### REFERENCES

- Aluri, G. S., Motayed, A., Davydov, A. V., Oleshko, V. P., Bertness, K. A., and Rao, M. V. (2013). Nitro-aromatic explosive sensing using GaN nanowire-titania nanocluster hybrids. *IEEE Sens. J.* 13, 1883–1888. doi: 10.1109/JSEN.2013.2241423
- Andrew, T. L., and Swager, T. M. (2007). A fluorescence turn-on mechanism to detect high explosives RDX and PETN. J. Am. Chem. Soc. 129, 7254–7255. doi: 10.1021/ja071911c
- Bastatas, L. D., Echeverria-Mora, E., Wagle, P., Mainali, P., Austin, A., and McIlroy, D. N. (2018). Emergent electrical properties of ensembles of 1D nanostructures and their impact on room temperature electrical sensing of ammonium nitrate vapor. ACS Sensors 3, 2367–2374. doi: 10.1021/acssensors.8b00746
- Bekyarova, E., Kalinina, I., Sun, X., Shastry, T., Worsley, K., Chi, X., et al. (2010). Chemically engineered single-walled carbon nanotube materials for the electronic detection of hydrogen chloride. *Adv. Mater.* 22, 848–852. doi: 10.1002/adma.200903427
- Blanco, G. A., Nai, Y. H., Hilder, E. F., Shellie, R. A., Dicinoski, G. W., Haddad, P. R., et al. (2011). Identification of inorganic improvised explosive devices using sequential injection capillary electrophoresis and contactless conductivity detection. *Anal. Chem.* 83, 9068–9075. doi: 10.1021/ac2020195
- Che, Y., Yang, X., Liu, G., Yu, C., Ji, H., Zuo, J., et al. (2010). Ultrathin ntype organic nanoribbons with high photoconductivity and application in

efficient method to achieve the response differences simply by the morphology tailoring, and consequently to realize the identification of nitro- and improvised explosives, which is an important attempt for the development of quality sensor array for explosive detection.

### DATA AVAILABILITY STATEMENT

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation, to any qualified researcher.

### **AUTHOR CONTRIBUTIONS**

All authors listed have made a substantial, direct and intellectual contribution to the work, and approved it for publication.

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### SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fchem. 2020.00029/full#supplementary-material

optoelectronic vapor sensing of explosives. J. Am. Chem. Soc. 132, 5743–5750. doi: 10.1021/ja909797q

- Chen, P. C., Sukcharoenchoke, S., Ryu, K., Gomez de Arco, L., Badmaev, A., Wang, C., et al. (2010). 2,4,6-Trinitrotoluene (TNT) chemical sensing based on aligned single-walled carbon nanotubes and ZnO nanowires. *Adv. Mater.* 22, 1900–1904. doi: 10.1002/adma.200904005
- Cho, S., Kwon, O. S., You, S. A., and Jang, J. (2013). Shape-controlled polyaniline chemiresistors for high-performance DMMP sensors: effect of morphologies and charge-transport properties. *J. Mater. Chem. A* 1, 5679–5688. doi: 10.1039/c3ta01427d
- Clark, R. P., and Shirley, S. G. (1973). Identification of skin in airborne particulate matter. *Nature* 246, 39-40. doi: 10.1038/246 039a0
- Dicinoski, G. W., Shellie, R. A., and Haddad, P. R. (2006). Forensic identification of inorganic explosives by ion chromatography. *Anal. Lett.* 39, 639–657. doi: 10.1080/00032710600609735
- Engel, Y., Elnathan, R., Pevzner, A., Davidi, G., Flaxer, E., and Patolsky, F. (2010). Supersensitive detection of explosives by silicon nanowire arrays. *Angew. Chem. Int. Edn.* 49, 6830–6835. doi: 10.1002/anie.2010 00847
- Ewing, R. G., Waltman, M. J., Atkinson, D. A., Grate, J. W., and Hotchkiss, P. J. (2013). The vapor pressures of explosives. *Trac-Trend Anal. Chem.* 42, 35–48. doi: 10.1016/j.trac.2012.09.010

- Flanigan, I. V. P. M., Brady, J. J., Judge, E. J., and Levis, R. J. (2011). Determination of inorganic improvised explosive device signatures using laser electrospray mass spectrometry detection with offline classification. *Anal. Chem.* 83, 7115–7122. doi: 10.1021/ac2014299
- Guo, L., Yang, Z., and Dou, X. (2017). Artificial olfactory system for trace identification of explosive vapors realized by optoelectronic schottky *Sensing* 29:1604528. doi: 10.1002/adma.201604528
- Guo, L., Zu, B., Yang, Z., Cao, H., Zheng, X., and Dou, X. (2014). APTS and rGO co-functionalized pyrenated fluorescent nanonets for representative vapor phase nitroaromatic explosive detection. *Nanoscale* 6, 1467–1473. doi: 10.1039/C3NR04960D
- Gurlo, A. (2011). Nanosensors: towards morphological control of gas sensing activity. SnO<sub>2</sub>, In<sub>2</sub>O<sub>3</sub>, ZnO and WO<sub>3</sub> case studies. *Nanoscale* 3, 154–165. doi: 10.1039/C0NR00560F
- He, G., Zhang, G., Lü, F., and Fang, Y. (2009). Fluorescent film sensor for vapor-phase nitroaromatic explosives via monolayer assembly of oligo (diphenylsilane) on glass plate surfaces. *Chem. Mater.* 21, 1494–1499. doi: 10.1021/cm900013f
- Hutchinson, J. P., Evenhuis, C. J., Johns, C., Kazarian, A. A., Breadmore, M. C., Macka, M., et al. (2007). Identification of inorganic improvised explosive devices by analysis of postblast residues using portable capillary electrophoresis instrumentation and indirect photometric detection with a light-emitting diode. *Anal. Chem.* 79, 7005–7013. doi: 10.1021/ac0708792
- Johns, C., Shellie, R. A., Potter, O. G., O'Reilly, J. W., Hutchinson, J. P., Guijt, R. M., et al. (2008). Identification of homemade inorganic explosives by ion chromatographic analysis of post-blast residues. *J. Chromatogr. A* 1182, 205–214. doi: 10.1016/j.chroma.2008.01.014
- Kuila, D., Chakrabortty, A., Sharma, S., and Lahiri, S. (2006). Composition profile of low explosives from cases in India. *Forensic Sci. Int.* 159, 127–131. doi: 10.1016/j.forsciint.2005.06.012
- Lee, S. M., Park, G. C., Seo, T. Y., Jung, S. B., Lee, J. H., Kim, Y. D., et al. (2016). Facet-controlled anatase TiO<sub>2</sub> nanoparticles through various fluorine sources for superior photocatalytic activity. *Nanotechnology* 27:395604. doi: 10.1088/0957-4484/27/39/395604
- Li, H., Zhong, J., Vehkamäki, H., Kurtén, T., Wang, W., Ge, M., et al. (2018). Selfcatalytic reaction of SO<sub>3</sub> and NH<sub>3</sub> to produce sulfamic acid and its implication to atmospheric particle formation. *J. Am. Chem. Soc.* 140, 11020–11028. doi: 10.1021/jacs.8b04928
- Lichtenstein, A., Havivi, E., Shacham, R., Hahamy, E., Leibovich, R., Pevzner, A., et al. (2014). Supersensitive fingerprinting of explosives by chemically modified nanosensors arrays. *Nat. Commun.* 5:4195. doi: 10.1038/ncomm s5195
- Liu, R., Li, Z., Huang, Z., Li, K., and Lv, Y. (2019). Biosensors for explosives: state of art and future trends. *TrAC Trends Anal. Chem.* 118, 123–137. doi: 10.1016/j.trac.2019.05.034
- Liu, S. F., Moh, L. C., and Swager, T. M. (2015). Single-walled carbon nanotube-metalloporphyrin chemiresistive gas sensor arrays for volatile organic compounds. *Chem. Mater.* 27, 3560–3563. doi: 10.1021/acs.chemmater.5b00153
- Lyons, J. R. (2011). An estimate of the equilibrium speciation of sulfur vapor over solid sulfur and implications for planetary atmospheres. J. Sulfur Chem. 29, 269–279. doi: 10.1080/17415990802195615
- Mäkinen, M., Nousiainen, M., and Sillanpää, M. (2011). Ion spectrometric detection technologies for ultra-traces of explosives: a review. *Mass Spectrom. Rev.* 30, 940–973. doi: 10.1002/mas.20308
- Meng, H.-B., Wang, T.-R., Guo, B.-Y., Hashi, Y., Guo, C.-X., and Lin, J.-M. (2008). Simultaneous determination of inorganic anions and cations in explosive residues by ion chromatography. *Talanta* 76, 241–245. doi: 10.1016/j.talanta.2008.01.054
- Najarro, M., Morris, M. E. D., Staymates, M. E., Fletcher, R., and Gillen, G. (2012). Optimized thermal desorption for improved sensitivity in trace explosives detection by ion mobility spectrometry. *Analyst* 137, 2614–2622. doi: 10.1039/c2an16145a
- Olley, D. A., Wren, E. J., Vamvounis, G., Fernee, M. J., Wang, X., Burn, P. L., et al. (2010). Explosive sensing with fluorescent dendrimers: the role of collisional quenching<sup>†</sup>. *Chem. Mater.* 23, 789–794. doi: 10.1021/cm10 20355

- Peng, L., Hua, L., Wang, W., Zhou, Q., and Li, H. (2014). On-site rapid detection of trace non-volatile inorganic explosives by stand-alone ion mobility spectrometry via acid-enhanced evaporization. *Sci. Rep.* 4:6631. doi: 10.1038/srep06631
- Peters, K. L., Corbin, I., Kaufman, L. M., Zreibe, K., Blanes, L., and McCord, B. R. (2015). Simultaneous colorimetric detection of improvised explosive compounds using microfluidic paper-based analytical devices (µPADs). *Anal. Methods* 7, 63–70. doi: 10.1039/C4AY01677G
- Qu, J., Ge, Y. R., Zu, B. Y., Li, Y. X., and Dou, X. C. (2016). Transition-metal-doped p-Type ZnO nanoparticle-based sensory array for instant discrimination of explosive vapors. *Small* 12, 1369–1377. doi: 10.1002/smll.2015 03131
- Samet, J. M., Demarini, D. M., and Malling, H. V. (2004). Do airborne particles induce heritable mutations? *Science* 304, 971–972. doi: 10.1126/science.1097441
- Schnorr, J. M., van der Zwaag, D., Walish, J. J., Weizmann, Y., and Swager, T. M. (2013). Sensory arrays of covalently functionalized single-walled carbon nanotubes for explosive detection. *Adv. Funct. Mater.* 23, 5285–5291. doi: 10.1002/adfm.201300131
- Senesac, L., and Thundat, T. G. (2008). Nanosensors for trace explosive detection. *Mater. Today* 11, 28–36. doi: 10.1016/S1369-7021(08)70017-8
- Steinfeld, J. I., and Wormhoudt, J. (1998). Explosives detection: a challenge for physical chemistry. Annu. Rev. Phys. Chem. 49, 203–232. doi: 10.1146/annurev.physchem.49.1.203
- Sun, Q., Wu, Z., Duan, H., and Jia, D. (2019). Detection of Triacetone Triperoxide (TATP) Precursors with an array of sensors based on MoS2/RGO composites. *Sensors* 19:1281. doi: 10.3390/s19061281
- Tao, J., Cuan, Q., Halpegamage, S., Addou, R., Gong, X.-Q., and Batzill, M. (2013). Combined surface science and DFT study of the adsorption of Dinitrotoluene (2,4-DNT) on rutile TiO<sub>2</sub> (110): molecular scale insight into sensing of explosives. J. Phys. Chem. C 117, 16468–16476. doi: 10.1021/jp40 5050a
- Wang, D., Chen, A., Jang, S.-H., Yip, H.-L., and Jen, A. K.-Y. (2011a). Sensitivity of titania (B) nanowires to nitroaromatic and nitroamino explosives at room temperature via surface hydroxyl groups. *J. Mater. Chem.* 21, 7269–7273. doi: 10.1039/c1jm10124b
- Wang, D., Chen, A., and Jen, A. K.-Y. (2013). Reducing cross-sensitivity of TiO<sub>2</sub>-(B) nanowires to humidity using ultraviolet illumination for trace explosive detection. *Phys. Chem. Chem. Phys.* 15, 5017–5021. doi: 10.1039/c3cp43454k
- Wang, D., Chen, A., Zhang, Q., and Cao, G. (2011b). Room-temperature chemiresistive effect of nanowires to nitroaromatic and nitroamine explosives. *IEEE Sens. J.* 11, 1352–1358. doi: 10.1109/JSEN.2010.20 89618
- Wang, J., Yang, L., Liu, B., Jiang, H., Liu, R., Yang, J., et al. (2014). Inkjet-printed silver nanoparticle paper detects airborne species from crystalline explosives and their ultratrace residues in open environment. *Anal. Chem.* 86, 3338–3345. doi: 10.1021/ac403409q
- Wu, Z. F., Zhou, C. Y., Zu, B. Y., Li, Y. S., and Dou, X. C. (2016). Contactless and rapid discrimination of improvised explosives realized by Mn<sup>2+</sup> doping tailored ZnS nanocrystals. *Adv. Funct. Mater.* 26, 4578–4586. doi: 10.1002/adfm.201600592
- Xie, G. S., and Liu, B. X. (2019). Fingerprinting of nitroaromatic explosives realized by aphen-functionalized titanium dioxide. *Sensors* 19:2407. doi: 10.3390/s19102407
- Yan, W., Zou, Y., Zhou, H., Wang, L., and Meng, X. J. J. (2017). Synergistic effect of sodium ions and fluoride ions on synthesis of pure-phase TiO<sub>2</sub>(B) nanorings. *J. Nanoparticle Res.* 19:192. doi: 10.1007/s11051-017-3889-4
- Yang, L., Ma, L., Chen, G., Liu, J., and Tian, Z. Q. (2010). Ultrasensitive SERS detection of TNT by imprinting molecular recognition using a new type of stable substrate. *Chem. Eur. J.* 16, 12683–12693. doi: 10.1002/chem.2010 01053
- Yang, Z., Dou, X., Zhang, S., Guo, L., Zu, B., Wu, Z., et al. (2015). A Highperformance nitro-explosives schottky sensor boosted by interface modulation. *Adv. Funct. Mater.* 25, 4039–4048. doi: 10.1002/adfm.201501120
- Yao, L., Garmash, O., Bianchi, F., Zheng, J., Yan, C., Kontkanen, J., et al. (2018). Atmospheric new particle formation from sulfuric acid and amines in a Chinese megacity. *Science* 361, 278–281. doi: 10.1126/science.aao4839

- Zhao, J. X., Li, W. T., Li, X., and Zhang, X. K. (2017). Low temperature synthesis of water dispersible F-doped TiO<sub>2</sub> nanorods with enhanced photocatalytic activity. *RSC Adv.* 7, 21547–21555. doi: 10.1039/C7RA00850C
- Zhao, X., and Yinon, J. (2002). Forensic identification of explosive oxidizers by electrospray ionization mass spectrometry. *Rapid Commun. Mass Spectrom.* 16, 1137–1146. doi: 10.1002/rcm.692
- Zhou, Q., Peng, L., Jiang, D., Wang, X., Wang, H., and Li, H. (2015). Detection of nitro-based and peroxide-based explosives by fast polarity-switchable ion mobility spectrometer with ion focusing in vicinity of faraday detector. *Sci. Rep.* 5:10659. doi: 10.1038/srep10659
- Zhu, D., He, Q., Chen, Q., Fu, Y., He, C., Shi, L., et al. (2011). Sensitivity gains in chemosensing by optical and structural modulation of ordered assembly arrays of ZnO nanorods. *ACS Nano* 5, 4293–4299. doi: 10.1021/nn10 3211d
- Zu, B., Guo, Y., and Dou, X. (2013). Nanostructure-based optoelectronic sensing of vapor phase explosives–a promising but challenging method. *Nanoscale* 5, 10693–10701. doi: 10.1039/c3nr03792d

**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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