

# Electronic Nose Technology Based on Quantum Dot Filters

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## Abstract

The electronic nose with chemical dyes as sensor can react with target gas and have specific color changes. In general, RGB camera collects a group of images to record these changes used for pattern recognition. RGB filters are not sensitive to the slight color changes, which limits the performance of this kind of electronic nose. This paper demonstrates using quantum dot spectroscopy technology to solve this problem. Multiple quantum dot filters are placed on the surface of image sensor. When capturing images, there are more response channels of the same incident light than RGB filters. Simulation and experiment both prove that quantum dot filters with appropriate processing are more sensitive to color changes than RGB filters.

## **Keywords**

Quantum Dots, Spectrum, RGB Filters, Pattern Recognition

## **1. Introduction**

An electronic nose is an equipment that imitates the olfactory system of mammals. In general, it consists of two parts. One is an array of gas sensors acting like olfactory receptor cells of creatures, which can convert the gas information to easy detected variables, such as voltage, resistance. The other is a pattern recognition system to recognize the type, concentration or acidity of target gas according to the measured variables like creature brains [1] [2] [3]. There is a kind of sensor array made of specific chemical dyes, which can react with target gas and change colors. RGB camera collects a group of images to record these changes and recognition system output the results through image processing [4] [5] [6]. The limitation of this method is that RGB camera is not sensitive to the variety of reflection spectrum of chemical dyes before and after the reaction. Sometimes, RGB camera can even get same response with different reflection spectrum (metamerism).

Quantum dot spectroscopy is a kind of emerging technology, which use a variety of quantum dot colloids to make films as filters. Films with different light transmission curves filter the incident light spectrum. The image sensor can record the transmitted intensities of different filters simultaneously. The origin spectrum can be reconstructed by resolving a group of filter transmission equations [7].

This paper demonstrates using a group of quantum dot filters to capture the slight color changes of electronic nose sensors and trying to get better results than RGB filters by appropriately processing on the quantum dot data.

#### 2. Experiment Design

In the experiment, acetic acid with different concentrations generates target gas by volatilization. Specific sensors made of pH indicator Bromothymol Green (with NaOH solution) react with target gas in a closed container for a certain time. The changes before and after the reaction are measured by quantum dot camera, color camera and spectrometer respectively. Quantum dot camera, which has nine filters on the image sensor surface, captures the transmitted intensity of signal light. Color camera with RGB filters on the surface of the image sensor, collects data for comparison. Spectrometer records reflection spectrum of sensors for simulation.

For data processing, acetic acid with five different concentrations (0.0%, 0.6%, 1.2%, 1.8% and 2.4%) correspond to class labels 1 - 5. Thus, pattern recognition method can be used for quantitative analysis. The recognition rate, false alarm rate can be used to judge the performance of RGB filters and quantum dot filters.

Spectrum data can simulate the outputs of RGB filters and quantum dot filters. In the simulation, it is convenient to find appropriate method for processing quantum dot data with the help of spectrum. Finally, actual data is used to verify the simulation and differences are analyzed.

#### **3. Simulation**

Regardless of the quantum efficiency of image sensor, the transmitted intensities of RGB filters and quantum dot filters are described as Equation (1)

$$I_i = \sum_{\lambda} \Phi(\lambda) T_i(\lambda), \ i = r, g, b, q1, q2, ..., q9$$
(1)

where  $\Phi(\lambda)$  is the incident light spectrum,  $T_i(\lambda)$  is the transmission curve of different filters, and  $I_i$  is the transmitted intensity corresponding to  $T_i(\lambda)$ . The spectrum data measured by spectrometer perform as incident light. Outputs are the projection of incident light under the RGB and quantum dot, whose transmission curves shows in **Figure 1**.



Figure 1. RGB (a) and quantum dot (b) transmission curves.

#### **3.1. Preprocessing and Recognition**

As the origin state of different groups is not exactly the same, changes of the reaction cannot be shown simply by after-reaction data. Therefore, feature vectors are demanded to represent the changes. The ratio of the intensity is capable for feature vector.

$$R_{s} = (I_{\lambda 1} / I_{\lambda 1}^{0}, I_{\lambda 2} / I_{\lambda 2}^{0}, ..., I_{\lambda n} / I_{\lambda n}^{0})$$
(2)

$$R_{rgb} = (I_r / I_r^0, I_g / I_g^0, I_b / I_b^0)$$
(3)

$$R_{qd} = (I_{q1} / I_{q1}^0, I_{q2} / I_{q2}^0, ..., I_{q9} / I_{q9}^0)$$
(4)

 $R_s$ ,  $R_{rgb}$  and  $R_{qd}$  are feature vectors of spectrum, RGB and quantum dot. As in Equation (2), spectrum is discrete from 360 nm - 700 nm with 1 nm interval. Support vector machine (SVM) is used to train and test feature vectors [8]. **Table 1** shows the results of the overall recognition rate and false alarm rate of five different concentrations.

Spectrum has the best results due to high dimension and completeness of target wavelength band. Direct projection of spectrum under RGB and quantum dot base result bad for not sensitive to color changes. Delicate sensitive base is needed to achieve better result, which can be devised using existing quantum dot base.

Down sampling is equivalent to a group of filters with square band-pass curves whose bandwidth is n nm. Spectrum does an average every n nm. The amount of data becomes 1/n of the original. **Table 2** shows the classification results of different compressed rate. It is feasible to design band-pass base with quantum dot for improving the performance.

#### 3.2. Quantum Dot Processing

Quantum dot filters are used to fit band-pass filter. Target transmission base is a series of Gaussian band pass curves. The center wavelength of these curves covers from 400 nm - 640 nm with 20 nm interval and full width at half maximum is 20 nm. As in Equation (5),  $T_a(\lambda)$  represents the target curves and  $I_a$  is the trans-mitted intensity.

$$I_a = \sum_{\lambda} \Phi(\lambda) T_a(\lambda)$$
(5)

The quantum dot base can generate new base by linear combination.

$$\tilde{T}_{a}(\lambda) = \sum_{i} a_{i} T_{i}(\lambda)$$
(6)

New transmission base can be as close as possible to the target base by adjusting the linear coefficients. The optimization equation is to minimize the square error between target base and new base.

Feature Vector	Recognition Rate	False Alarm Rate
$R_s$	0.8273	0.0423
$R_{_{rgb}}$	0.6263	0.0935
$R_{_{qd}}$	0.5501	0.1128

Table 2. Classification results of compressed spectrum.

Compression Rate	1	4	10	20	68	85
Recognition Rate	0.8273	0.8187	0.8540	0.8636	0.7511	0.7184

$$\min \left\| T_a(\lambda) - \tilde{T}_a(\lambda) \right\|^2, \ s.t. \ 0 \le \tilde{T}_a(\lambda) \le 1$$
(7)

Simplified solution is Equation (8).

$$\boldsymbol{a} = \arg\min\left\|\boldsymbol{T}_{a}(\boldsymbol{\lambda}) - \boldsymbol{\tilde{T}}_{a}(\boldsymbol{\lambda})\right\|^{2} = \arg\min\left\|\boldsymbol{T}_{a}(\boldsymbol{\lambda}) - \sum_{i} a_{i} \boldsymbol{T}_{i}(\boldsymbol{\lambda})\right\|^{2}$$
(8)

The outputs of reconstructed target base can be generated by linear combination with coefficients a.

$$\tilde{I}_a = \sum_{\lambda} \Phi(\lambda) \tilde{T}_a(\lambda) = \sum_{\lambda} \Phi(\lambda) (\sum_i a_i T_i(\lambda)) = \sum_i a_i (\sum_{\lambda} \Phi(\lambda) T_i(\lambda)) = \sum_i a_i I_i \quad (9)$$

New feature vector  $R_a$  is as Equation (10).

$$\tilde{R}_{a} = (\tilde{I}_{a1}/\tilde{I}_{a1}^{0}, \tilde{I}_{a2}/\tilde{I}_{a2}^{0}, ..., \tilde{I}_{a12}/\tilde{I}_{a12}^{0})$$
(10)

The target base and reconstructed base are shown in **Figure 2**. Most reconstructed base fit well on target base. While for spectrum below 460 nm and above 620 nm, quantum dot base has similar shape and linear combination cannot perform well. Thus, the Gaussian band-pass base with center wavelength below 460 nm and above 620 nm have high reconstruction errors. **Table 3** shows the improvement of quantum dot data after processing.

#### 4. Verification

**Table 4** shows the actual data captured by RGB camera and quantum dot camera. The classification results have the same trend as the simulation results. Differently, processed quantum dot outputs do not have as much improvement as the simulation process. The digital accuracy and acquire noise of camera affect the results.

 Table 3. Comparison of simulation.

Feature Vector	Recognition Rate	False Alarm Rate
$R_{_{rgb}}$	0.6263	0.0935
$R_{_{qd}}$	0.5501	0.1128
$ ilde{R}_{_a}$	0.7702	0.0583

Table 4. Comparison of actual data classification.

Feature Vector	Recognition Rate	False Alarm Rate
$R_{rgb}$	0.6351	0.0912
$R_{_{gd}}$	0.6222	0.0944
$ ilde{R}_{_a}$	0.7111	0.0722



Figure 2. Target base and reconstructed base by quantum dot base.

#### **5.** Conclusion

Quantum dot filters are more sensitive to slight color changes and have a higher dimension compared to RGB filters. With appropriate data processing method, the information of a certain wavelength band can be enlarged. If the number of quantum dots is enough, the origin spectrum can be even resolved and used for classification. Furthermore, quantum dot base has larger area of integration than RGB transmission base so weak light can be captured.

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