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Innovative technique for analysis of wastewater contaminants using hyperspectral imaging

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Accurate, fast, quantitative on-site analysis of wastewater is an environmental necessity. Therefore, we report a quantitative spectroscopic study in order to analyse organic contaminants in wastewater. For this purpose, two spectroscopy-based techniques were utilised and their results are compared. The first technique is ultraviolet/visible (UV/vis) spectrophotometry. This technique is a standard laboratory technique, however, it is inappropriate for working in the field. Besides, the analysis results of the standard laboratory technique display low accuracy in detecting small concentrations of wastewater contaminants such as methylene blue (< 20 ppm). Accordingly, there is a need for another technique to overcome the shortcomings of UV/vis spectrophotometry. Hyperspectral imaging (HSI) combines imaging and spectrometry. HSI works on-site since it is portable and easy to operate. The analysis of the data acquired by HSI showed a higher efficacy in accurately detecting both low (< 20 ppm) and high concentrations (> 50 ppm) of water contaminants such as methylene blue and methyl orange. For verification, Pearson correlation coefficients were computed between the concentration of contaminants and their absorbance for all the operating spectral bands. The results of the two techniques were statistically compared using Bland and Altman's limit of agreement. This study showed that HSI is potentially a promising technique for the analysis of wastewater contaminants on-site.

Keywords: spectrophotometry, hyperspectral imaging, chemical dyes, methylene blue, methyl orange

Introduction

The past half-century has witnessed a significant increase in the disposal of industry-produced wastewater into the Earth's natural water resources due to the immense growth of industrial establishments. Industrial wastewater contains a variety of contaminants which can be

solids, liquids, inorganic and organic materials.¹ Among these contaminants, organic materials require particular care when determining the level of water contamination on-site.¹ Organic pollutants, such as manufacturing dyes including methylene blue (MB) and methyl orange

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(MO), are among the most common organic contaminants in wastewater. These dyes are commonly used in the production of many goods such as leather, paper, detergents and cosmetics.² If untreated, organic contaminants, which flow to water sources with the effluent stream, pose a serious hazard to all living creatures when they reach a certain concentration: the discharge of large amounts of chemical dyes in industrial effluent can lead to a highly toxic effect.³ Organic contamination also requires expensive treatment of water due to problems such as high turbidity, bad odour and adverse colour.

A high concentration of organic contaminants in natural water decreases the penetration of sunlight, which is required for photosynthesis by some aquatic microorganisms.⁴ Moreover, dye contaminants decrease oxygen dissolution in water by preventing gaseous oxygen from crossing the air–water interface. Rather, they exert an oxygen demand. Hence, marine life can be affected harshly due to dissolved oxygen depletion.⁴ If the contaminated water reaches soil, it will clog its pores and the roots of the existing plants will cease to grow.⁵ Furthermore, MB and MO are carcinogenic if they reach the human body through drinking water, absorption through the skin or the ingestion of contaminated food.⁶ Thus, MB and MO were selected in this study as organic dyes heavily produced in large amounts by industry.⁷ Industries such as fabric, medicinal, leather, foodstuff production, cosmetic and paint release into the environment approximately 10–15% of the more than 800,000 tons of distinct types of dyes manufactured worldwide each year.⁸

MB is a cationic dye distinguished by a remarkable change in its optical properties when aggregated in a sample.⁹ For instance, it exhibits two absorption peaks around 293 nm and 664 nm in diluted aquatic solutions.¹⁰ The chemical structure of MB is responsible for its absorption peaks. To explain more, the MB monomer displays an absorption peak around 664 nm, for the MB dimer structure this peak moves to 605 nm and in the MB trimer the peak moves to 575 nm.¹⁰ The molar coefficients of absorption for all MB chemical structures were reported to be in the range from 40 to $90 \times 10^3 \text{ M}^{-1} \text{ cm}^{-1}$.¹⁰ MO dyes belong to the azo group of anionic dyes.¹¹ This group includes the nitrogen chromophore and the aromatic structure, as such it is cumbersome to extract it from wastewater either by chemical or biological degradation.¹¹

International environmental and health organisations have established guidelines limiting the concentration

of contaminants in wastewater produced by industry.¹² For this purpose, monitoring the concentrations of the industrial effluent is essential. Different methods are used to accomplish this goal by analysing samples either on-site or at in-field laboratories. A popular approach for precise qualitative and quantitative analysis of the chemical dyes in aqueous solutions is ultraviolet/visible (UV/vis) spectroscopy.^{2,10,13} The UV/vis spectrum has sufficient energy to excite valence electrons in various atoms and molecules. Spectrophotometers are highly reliable and precise in spectral measurements, as such they are considered the gold standard for many chemical analysis procedures. However, spectrophotometers are not flawless. For instance, they are less favoured for use outdoors due to being bulky, requiring time-consuming sample preparation and being highly sensitive to the surrounding optical and electronic noise.¹⁴

Compared to spectrophotometry, hyperspectral imaging (HSI) has a lower spectral resolution. However, HSI is very consistent in spectral measurements in addition to being entirely suitable for outdoor measurements, simple to maintain and easy to use. The analysis of HSI data is typically customised for each case so as to achieve classification of the particular objects of interest to the user.^{15–17} HSI combines imaging and spectroscopy in one platform. This combination produces a three-dimensional data format.^{18,19} This data includes two-dimensional spatial information along a third spectral dimension to form a datacube. The datacube's spatial information is contained in an image of the object, and its spectral information is included in capturing the same image using a sequence of spectral bands. A great advantage of HSI is providing a spectral identity for every single pixel enclosed in the field of view. For that advantage, HSI finds application in divergent fields of research such as in agriculture,^{20,21} nutrients production,^{22,23} space science,¹⁵ forensic medicine²⁴ and health science.^{25–28} To the best of our knowledge, there has been no report in the literature of the use of HSI for quantitative chemical analysis on-site. The present work is a steady accumulation of the ongoing research regarding the application of HSI in the chemical analysis field of research. In this work, HSI is employed to quantitatively analyse two wastewater organic contaminants, MB and MO, since they are produced in large quantities by factories. This work reports a comparative study between HSI and UV/vis spectrophotometry for monitoring wastewater

contamination. For the comparison, various aqueous concentrations of the two contaminants were prepared, measured, imaged and finally quantitatively analysed. Figure 1 displays a schematic diagram for the two techniques compared in this work.

Materials and methods

Preparation of dye samples

The organic dyes used in this study, MB and MO, were purchased from Sigma-Aldrich (St Louis, Missouri, USA).⁹ The MB and MO dyes did not undergo any purification process after being purchased. The water used for sample preparation was distilled using the reverse osmosis procedure following normal laboratory procedures.¹⁰ The

aqueous dye solutions were meticulously prepared from recently purchased MB and MO stocks. The dilution of the dye solution was carried out at room temperature ($24 \pm 1^\circ\text{C}$). The pH value was measured to be 7.48 ± 0.13 for MB samples and 7.95 ± 0.19 for MO.

MB and MO samples were prepared in the laboratory in an ample quantity (0.25 L) for each concentration listed in Table 1. The prepared quantity is calculated to provide three samples (2 cm^3) for the UV/vis spectrophotometer, three other samples (10 cm^3) for the HSI system and a sufficient amount for any accidental loss. The process of preparing this quantity (0.25 L) for each dye concentration was repeated two times over the elapsed time of the study. The temperature and pH level for the dye samples were maintained in order to prevent MB and MO dimerisation.⁹

Figure 1. A schematic diagram of the UV/vis spectrophotometer and hyperspectral imaging (HSI) experimental setups used to objectively measure the concentration of MB and MO in aqueous solutions. Top: the UV/vis spectrophotometer, in this study, consists of tungsten and deuterium lamps that radiate toward a wavelength selection module. The selection module is responsible for passing certain bands of the illumination one after another to interact with the sample under test. The transmitted radiation intensity is detected with a light detector. Bottom: the HSI system, on the other hand, is composed of a broadband light-emitting diode (LED) for illuminating the samples of interest and the backscattered light is filtered and recorded band by band using a matrix of light detectors. Computers, in both setups, are used for data acquisition and analysis. The back scattered light is collected by the HSI system in order to acquire the optical properties, based on the computed reflectance, of the dye aqueous solution. The reflectance of the dye solution is computed based on the scattered photons that interact with the particles of the dye. This interaction provides a spectral signature which identifies the dye qualitatively and quantitatively.

Table 1. The set of the prepared cationic and anionic dye aqueous solutions

Dye aqueous solution	Methylene blue	Methyl orange
1	10 ppm	10 ppm
2	12 ppm	12 ppm
3	14 ppm	14 ppm
4	16 ppm	16 ppm
5	18 ppm	18 ppm
6	20 ppm	20 ppm
7	30 ppm	30 ppm
8	40 ppm	40 ppm
9	50 ppm	50 ppm

Absorption spectrophotometer

The study measurements were carried out in one day for all the samples of each dye group to preserve the same conditions (temperature and humidity). All the samples, including distilled water samples, were poured into quartz cuvettes, of 1 cm thickness, immediately before the absorption spectra measurements. The absorption spectra of the aqueous MB and MO samples were measured three times consecutively on the spectrophotometer (UV-1800, TOMOS, USA) according to the standard operating procedure.

Hyperspectral imaging system

Typically, an HSI optical setup employs a broadband illumination source emitting radiation in the spectral region of interest. The illumination source employed for this study was a light-emitting diode (LED) white lamp (wavelength range 400–700 nm). The reason for the employment of the LED source is our interest in the visible region of the optical spectrum. The HSI-collected data was, in this study, captured via a portable SOC-710 hyperspectral imaging camera (Surface Optics Corporation, San Diego, CA, USA). The SOC-710 features a 12-bit image sensor (high signal-to-noise ratio charge-coupled device) with an average spectral resolution of ~5.3 nm. The sensor operates in ambient/external lighting conditions using variable times of exposure and electronic gain. The SOC-710 camera is capable of acquiring spectral data in the range of 380–1051 nm in 128 consecutive bands.

HSI data consist of an uninterrupted sequence of images for the field of view (FOV), yet each image is taken at a distinct spectral band. The spectral sequence

of images for the FOV is termed a datacube, since it is a three-dimensional matrix. The hyperspectral datacube, produced by the SOC-710 model of hyperspectral imaging camera, has the following dimensions: $x = 696$ pixels, $y = 520$ pixels and $z = 128$ spectral bands). The spectral profile computed for each dye sample is equal to the average reflectance of seven pixels selected along the test tube we used to hold the sample from the top to the bottom. The seven pixels are separated by 30 pixels along the longitudinal axis of the test tube.

Two datacubes, other than the object's one, are captured as a rule: one for the dark current of the image sensor and the second for a white standard diffuse reflectance surface. Using the three datacubes, the reflectance for the object of interest is computed. Initially, the dark current pixel intensities (I_{dc}) are subtracted from both the corresponding object (I_{obj}) and the white surface (I_{ws}) pixel intensities. Afterwards, the noise-free object's datacube is compensated for uneven illumination by dividing it by the corresponding pixel intensities for the white standard. Accurate compensation necessitates preserving the exact environment of imaging for all the datacubes. Summing up, the object reflectance (R_{obj}) is calculated as shown in Equation (1). The selection of the user-defined pixels and the computed-based-reflectance were done with custom code written in MATLAB (The Mathworks Inc., Natick, Massachusetts, USA).

$$R_{obj} = \frac{I_{obj} - I_{dc}}{I_{ws} - I_{dc}} \quad (1)$$

Experimental work and results

Absorption experiments

The experiments were carried out on two groups of aqueous solutions, one for MB and the other for MO dye. The experimental work was performed at room temperature and ambient humidity. The pH of the aqueous solutions was standardised by taking the average of multiple points on the calibration curve measurements. The absorbance value was computed according to the Beer-Lambert law:

$$A = \epsilon b C \quad (2)$$

where A is the absorbance, ϵ is the molar absorptivity ($M^{-1}cm^{-1}$), b is the width of the cuvette carrying the sample and C is the instantaneous concentration of the dye in the solution. Using Equation (2), the spectral profiles

Figure 2. The measured absorption spectra for (a) MB samples (10, 12, 14, 16, 18, 20, 30, 40 and 50 ppm), (b) MO samples (10, 12, 14, 16, 18, 20, 30, 40 and 50 ppm) using the UV/vis spectrophotometer.

for the samples of both MB and MO in the concentration range of 10–50 ppm were obtained from the UV/vis spectrophotometer measurements. The spectral profiles for both the MB and the MO dyes are displayed in Figure 2(a, b), respectively.

The UV/vis spectrophotometer measurements for the MB and MO dyes exhibited a higher absorption at the wavelengths of 660 nm and 440 nm, respectively. Figure 3 displays the relation between the computed absorbance and the concentration for each dye solution

at its distinguished absorption spectral band. According to Equation (2) this relation should be linear. However, the absorption measurements for the MB samples showed an obvious non-linearity in the absorption/concentration relationship. This non-linearity pointed to the low accuracy of the UV/vis spectrophotometer in detecting the high concentrations of some dyes, including MB in aqueous solutions as shown in Figure 3(a). The observed non-linearity of the UV/vis spectrophotometer also accounts for the poor performance of the device for dilute dye solutions.

Figure 3. (a) the absorbance measured at 660 nm, using the UV/vis spectrophotometer for the group of MB aqueous solutions with concentrations of 10, 12, 14, 16, 18, 20, 30, 40 and 50 ppm. (b) the absorbance measured at 440 nm for the group of MO aqueous solutions with concentrations of 10, 12, 14, 16, 18, 20, 30, 40 and 50 ppm. Both graphs have linear fitting in black dots to estimate how close the absorbance measurements of the dye samples are related to its concentrations.

Hyperspectral imaging and data processing

All the dye samples prepared for this study were imaged and their reflectance was computed three times. The reason for repeating the computation is the minimisation of possible random errors. Based on the reflectance, the absorbance is calculated using Equation (3), where A_{obj} signifies the absorbance of the dye sample using HSI-collected data.

$$A_{obj} = \log \left(\frac{1}{R_{obj}} \right) \quad (3)$$

Figure 4 displays the average computed absorbance for the MB and MO samples listed in Table 1.

Following the absorbance computation, it is of interest to identify the distinguishing spectral band that highlights the change of the dye concentration and verify that with the spectrophotometer. For this, Pearson correlation coefficients were calculated for all the spectral bands captured by the HSI camera against the concentrations of the dyes in all samples. The spectral band that had the highest correlation coefficients was the optimal one. The absorbance of the dye samples in the optimal band was considered the reference for comparison between HSI and the spectrophotometer as shown in Figure 5.

Discussion

The results of the absorption experiment demonstrated that UV/vis spectrophotometry is limited in the precise identification of the different dye aqueous solutions as shown in Figure 3(a). Beer–Lambert's law implies a linear relationship, however, this relation is contravened for molecules of large size and heavy molecular weight including certain chemical dyes. This contravention is attributed to the interaction between analyte molecules. These interactions of the dye molecules are controlled by intermolecular attractive forces such as hydrogen bonding and van der Waals forces. Such forces change the absorptivity of the analyte and result in a non-linear response as concentration increases. Added to the former, changes in the solution refractive index (n) with analyte concentration probably alters the position, size and solid angle of the captured image upon the detector.

The UV/vis spectrophotometer performance in differentiating the MB samples in the concentration range of 10–50 ppm is less accurate compared to the lower range of 10–20 ppm, as shown in Figure 5(a). So, we tried to find an alternative method that could differentiate accurately between the high and low concentrations of dye-based MB samples. HSI should be useful for this since it is a combination of spectrophotometry and imaging in one platform. Thus, it

Figure 4. Results of the hyperspectral imaging of both MB and MO aqueous solutions. (a) the computed average absorbance for the group of MB with concentrations in the range of 10–50 ppm along the spectral range of 350–700 nm and (b) the computed average absorbance for the group of MO with concentrations in the range of 10–50 ppm along the spectral range of 400–600 nm.

Figure 5. (a) the maximum absorbance, detected at 660nm, of MB using the UV-VIS-1800 spectrophotometer combined with linear fitting (blue dashed line), and the corresponding absorbance of the SOC-710 HSI camera, captured at 660nm and 571 nm bands combined with linear fitting (red and black dashed lines, respectively). (b) the maximum absorbance, detected at 440nm, of MO using the UV-VIS-1800 spectrophotometer combined with linear fitting (blue dotted line), and the corresponding absorbance of the SOC-710 HSI camera, captured at 440nm and 513nm bands combined with linear fitting (red and black dashed lines, respectively). The R^2 value (coefficient of determination) is displayed for each group of data points.

simultaneously provides spectral and spatial information. Using this information, HSI is able to quantitatively differentiate between the different solutions with variable concentrations. For verification purposes, a comparison between the computed absorbance of the dye-based solutions, using spectrophotometry and HSI, is shown in Figure 5(a and b, respectively). The computed absorbance, in Figure 5, shows a very close performance of HSI compared to the spectrophotometer, in differentiating between the MB samples (10–20 ppm) and the MO samples (10–50 ppm). However, HSI out-performs the spectrophotometer in differentiating the high concentrations of MB samples (20–50 ppm), as shown in Figure 5(a). The spectrophotometer identified the wavelengths 660nm and 440nm for MB and MO maximum absorbance, respectively. However, these bands were not the ones with the highest correlation with MB and MO dyes using the HSI system. HSI was able to better distinguish the different concentrations of MB and MO at bands close to the one identified by the spectrophotometer as shown in Figure 5(a and b) at 576nm and 513nm, respectively.

Beside the experimental analysis, it was informative to measure the degree of agreement of HSI compared to UV/vis spectrophotometry in order to assess HSI reliability.

For this purpose, a correlation between the computed absorbance of one group of dye-based samples, based on UV/vis spectrophotometry and HSI, was computed. The MO group of samples was used for computing the correlation coefficients, since the computed absorbance from both spectroscopic techniques is similar. The correlation coefficients were plotted against a diagonal line, representing the state of equality between the two instruments, with angle of 45° , as shown in Figure 6. The computed correlation coefficient indicated a very close agreement for the measured MO samples using the two methods investigated in this study. Thus, HSI is likely to be a reliable alternative technique to UV/vis spectrophotometry for both qualitative and quantitative *in situ* analysis.

Bland and Altman's limits of agreement (LOA) is a reliable statistical tool used to check the agreement between two techniques used for the same purpose. The obtained results from HSI and UV/vis spectrophotometry were the input data for the Bland and Altman's LOA in this study. The LOA are depicted in Figure 7. Since the results from HSI and UV/vis spectrophotometry lie between the upper and lower LOA, HSI is statistically verified as a suitable technique to replace UV/vis spectrophotometry for *in situ* analysis of dye samples.

Figure 6. The correlation between the normalised measurements by UV/vis spectrophotometry and the corresponding ones by HSI for the MO group of samples.

Conclusion

This study confirms the consistency of using HSI as a quantitative analysis technique to detect and quantify organic wastewater contaminants. Dye samples of both MB and MO underwent analysis by UV/vis spectrophotometry and HSI, which were shown to be precise, simple, rapid and low-cost methods for analysing samples for

wastewater organic contaminants in the laboratory. In fact, UV/vis spectrophotometry is one of the standard methods used for analysing contaminated water. However, by experiment, it is found that the spectrophotometer has certain limitations. These limitations were clear while evaluating the presence of industrial dyes like MB in water. We hypothesised that hyperspectral imaging could overcome the limitations of UV/vis spectrophotometry in detecting dyes present in water like MB and MO.

For verification purposes, nine distinct concentrations of both MB and MO dyes in aqueous solutions were accurately prepared in the chemistry laboratory using standard laboratory procedures. The prepared dye samples were split into two groups, one tested by UV/vis spectrophotometry and the other by HSI. We concluded:

1. UV/vis spectrophotometry is a standard technique for analytical chemistry, but it is limited in detecting low concentrations of dyes like MB in aqueous solutions.
2. UV/vis spectrophotometry is limited to small amounts of samples that fit into the standard cuvette of the device. For large amounts or numbers of samples, experiments need to be repeated several times which is a time expensive process when working in the field.

Figure 7. Bland-Altman plot of mean and percentage difference between UV/vis spectrophotometry and HSI. Bland and Altman's LOA is a reliable statistical tool used to check the agreement between two techniques used for the same purpose. Dashed lines show intervals for ± 1.96 multiple of the standard deviation using the spectrophotometer results in the denominator. The dot points represent five distinct concentrations (10, 20, 30, 40 and 50 ppm) of MO aqueous solutions.

3. The UV-vis device is a laboratory-friendly instrument, yet it is hard to tailor it for the harsh environment of contaminated water produced by industry.
4. HSI overcomes the limit of small quantity of samples by analysing an adjustable field of view for the object of interest. Thus, it saves the processing time for analysis done by the UV/vis spectrophotometer in the laboratory. Therefore, HSI is more appropriate for on-site analysis of industrial contaminated water.
5. More investigation is required to generalise this technique of analysis for inorganic contaminants such as chromates and heavy metals.

Conflict of interest

Authors have no conflict of interest relevant to this article.

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