Application of UV absorbance and fluorescence indicators to assess the formation of biodegradable dissolved organic carbon and bromate during ozonation

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Abstract:

This study examined the significance of changes of UV absorbance and fluorescence of dissolved organic matter (DOM) as surrogate indicators for assessing the formation of bromate and biodegradable dissolved organic carbon (BDOC) during the ozonation of surface water and wastewater effluent. Spectroscopic monitoring was carried out using benchtop UV/Vis and fluorescence spectrophotometers and a newly developed miniature LED UV/fluorescence sensor capable of rapidly measuring UVA280 and protein-like and humic-like fluorescence. With the increase of O_3/DOC mass ratio, the plots of BDOC formation were characterized of initial lag, transition slope and final plateau. With the decrease of UV absorbance and fluorescence, BDOC concentrations initially increased slowly and then rose more noticeably. Inflection points in plots of BDOC versus changes of spectroscopic indicators were close to 35-45% loss of UVA254 or UVA280 and 75-85% loss of humic-like fluorescence. According to the data from size exclusion chromatography (SEC) with organic carbon detection and 2D synchronous correlation analyses, DOM fractions assigned to operationally defined large biopolymers (apparent molecular weight, AMW>20 kDa) and medium AMW humic substances (AMW 5.5-20 kDa) were transformed into medium-size building blocks (AMW 3-5.5 kDa) and other smaller AMW species (AMW<3 kDa) associated with BDOC at increasing O_3/DOC ratios. Appreciable bromate formation was observed only after the values of UVA254, UVA280 and humic-like fluorescence in O_3 -treated samples were decreased by 45-55%, 50-60% and 86-92% relative to their respective initial levels. No significant differences in

23 plots of bromate concentrations versus decreases of humic-like fluorescence were
24 observed for surface water and wastewater effluent samples. This was in contrast with
25 the plots of bromate concentration versus UVA₂₅₄ and UVA₂₈₀ which exhibited
26 sensitivity to varying initial bromide concentrations in the investigated water matrixes.
27 These results suggest that measurements of humic-like fluorescence can provide a
28 useful supplement to UVA indices for characterization of ozonation processes.

29 **Keywords:** ozonation; biodegradable dissolved organic carbon; bromate;
30 spectroscopic indicator; humic substances; online fluorescence sensor

1. Introduction

Ozonation has been widely used in drinking water and wastewater treatment for disinfection and oxidation purposes (Reungoat et al. 2012, von Gunten 2003a, b, Zimmermann et al. 2011). Extensive studies have shown that ozonation results in significant elimination of adverse biological effects of many organic micropollutants (e.g., endocrine disrupting chemicals, antibiotics, and pharmaceuticals) as well as removal of color, odor and taste (Dodd et al. 2009, Hollender et al. 2009, Huber et al. 2005, Lee et al. 2012, Liu et al. 2012a, Nakada et al. 2007, Peter and von Gunten 2007).

Ozone exposures required for disinfection and oxidation may result in the formation of undesirable organic and inorganic byproducts, including various disinfection byproducts (DBPs) and biodegradable dissolved organic carbon (BDOC) (von Gunten 2003b, Wert et al. 2007). Ozonation has been shown to convert relatively refractory components of dissolved organic matter (DOM) into BDOC (e.g., aldehydes, carboxylic acids, ketones and etc.) without a significant decrease in overall dissolved organic carbon (DOC) concentration (Liu et al. 2015, Nishijima et al. 2003, Wert et al. 2007). The ozonation-derived BDOC in turn largely defines the biological stability of ozonated water, as it can contribute to increases in bacterial regrowth in drinking water distribution systems or wastewater effluent receiving waters (Escobar and Randall 2001). As a result, ozonation is usually combined with a subsequent process of biological filtration to consume BDOC before the treated water is conveyed into a distribution system or a receiving water body. In this context,

characterization of changes of molecular weights (MW) of DOM and evaluation of BDOC formation may provide a better understanding of integrated O₃ biofiltration processes for DOC removal.

In addition, ozonation of bromide-containing water or wastewater leads to the formation of bromate (von Gunten and Oliveras 1998). Bromate is classified as a probable or likely human carcinogen, and many countries have established the maximum allowable level of bromate in drinking water at 10 µg/L (Butler et al. 2005). Unlike many organic DBPs, bromate is relatively stable and is difficult to remove using conventional treatment technologies (Butler et al. 2005, Nie et al. 2014). Although ecological impacts of bromate formation during wastewater ozonation are uncertain, the potential public health implications of bromate formation in potable water reuse scenarios utilizing ozonation could be significant. Hence it is of substantial interest to develop tools for better predicting and controlling bromate concentrations formed during both drinking water and wastewater ozonation.

The formation of BDOC and bromate, as well as the elimination of micropollutants, are directly related to the ozone exposure ($\int_0^t [O_3] dt$); that is, the time-dependent ozone concentration integrated over exposure time. An optimization of the ozone exposure is necessary to maximize the effect of oxidation and minimize the formation of undesired DBPs, especially BrO₃⁻. However, for wastewater effluents, it is difficult to measure a dissolved O₃ residual during the initial O₃ demand stage (Gerrity et al. 2012, Wert et al. 2009). Additionally, direct analyses of BDOC and bromate are time-consuming and expensive. Therefore, the development of surrogate

parameters for frequent online monitoring to enable more automated controls of ozone dosage is warranted. For example, the California Department of Public Health recently published a revised set of draft regulations for groundwater replenishment, which requires full advanced treatment facilities to identify at least one surrogate parameter that can be monitored continuously (Chon et al. 2015, Gerrity et al. 2012).

A number of studies have examined the performance of spectroscopic indicators, such as color, differential UV absorbance (UVA) and/or total fluorescence, and shown that such indicators were correlated with the removal efficiencies of organic micropollutants during ozonation (Gerrity et al. 2012, Li et al. 2016b, Liu et al. 2012b, Nanaboina and Korshin 2010, Wert et al. 2009). Recently, Chon et al. (2015) applied the concept of electron donating capacity of DOM combined with UVA254 measurements to evaluate the degradation of micropollutants and the formation of bromate. Other studies have assessed the use of UVA254 and related indices to quantify the formation of individual ozonation byproducts associated with BDOC (Liu et al. 2012a).

Measurements of UV absorbance at 280 nm by means of UV light emitting diodes (LEDs) provide an attractive, energy-efficient alternative to conventional UVA254 monitoring (Bridgeman et al. 2015, Tedetti et al. 2013). UVA280 has previously been found to correlate well with DOM molecular weight and aromaticity and exhibit lower spectral overlap than UVA254 with inorganic species such as NO_3^- and NO_2^- that may interfere with measurements in many waters (Chin et al. 1994). In addition, measurements of DOM fluorescence at selected excitation and emission

wavelengths provide a useful complement to UVA280 since fluorescence detection can also be implemented using LEDs and can enable more selective monitoring of chemically reactive protein-like and humic-like DOM components (Fimmen et al. 2007, Henderson et al. 2009). We recently demonstrated the use of a miniaturized LED UV/fluorescence sensor – capable of online measurement of UVA280, as well as protein-like and humic-like fluorescence – to predict DBP formation during chlorination (Li et al. 2016a).

The present study employs a sensor of this type to determine whether UVA280 and fluorescence indices may be used to develop correlations with BDOC and bromate formed during the ozonation of surface water and wastewater. To this end, degradation of DOM chromophores and fluorophores, MW changes, and formation of BDOC and bromate were examined during ozonation of a set of surface water and wastewater matrixes with varying initial bromide concentrations.

2. Material and methods

2.1. Water matrixes and reagents

Three water matrixes were used in the experiments described below. Secondary municipal wastewater effluent samples were taken from the West Point Treatment Plant in King County, WA (WWTP-I on Dec 14th, 2015 and WWTP-II on Feb 28th, 2016). This plant uses high-rate oxygen activated sludge technology without denitrification. The surface water was sampled from Lake Pleasant, which is a brown water eutrophic lake in Bothell, WA. Basic water characteristics of these waters are

shown in **Table 1**. All the water samples were immediately filtered through a 0.45 μm membrane upon collection and stored at 4 $^{\circ}\text{C}$ before use.

The following chemicals were used in this study: sodium bromide (Sigma-Aldrich, >99%), sodium bromate (Sigma-Aldrich, >99%), polyethylene glycol standards (Alfa Aesar), methylamine solution (Sigma-Aldrich, 40 wt. % in H_2O), and potassium indigotrisulfonate (Sigma-Aldrich).

2.2. Ozonation batch experiments

Five semi-batch ozonation experiments were performed at room temperature (25 ± 2 $^{\circ}\text{C}$) with the three water matrixes mentioned above to explore the formation of BDOC and bromate and evolution of spectroscopic indices during exposure to ozone. For the WWTP-I water matrix (DOC 5.82 mg/L), three semi-batch experiments were undertaken with spiked bromide concentrations of 50 $\mu\text{g/L}$ (WWTP-A, 322.9 $\mu\text{g/L}$ total Br^-), 100 $\mu\text{g/L}$ (WWTP-B, 373.8 $\mu\text{g/L}$ total Br^-) and 200 $\mu\text{g/L}$ Br^- (WWTP-C, 491.6 $\mu\text{g/L}$ total Br^-) respectively, to explore effects of initial Br^- concentration. For the WWTP-II water matrix (DOC 6.93 mg/L), one ozonation semi-batch experiment was performed using a 100 $\mu\text{g/L}$ Br^- spike (WWTP-D, 301.5 $\mu\text{g/L}$ total Br^-) as a comparison with the WWTP-I experiments. Because Lake Pleasant water had a high DOC concentration (14.87 mg/L), the water was diluted 2.5 times with Milli-Q water and spiked with 100 $\mu\text{g/L}$ Br^- (LP, 5.98 mg/L DOC and 116.1 $\mu\text{g/L}$ total Br^-).

Ozone was generated by an oxygen-fed ozonator (IN USA AC-2025; Norwood, MA, USA). The feed gas stream containing ozone was bubbled through 200 mL

WWTP effluent or 250 mL LP water samples contained in a 500 mL borosilicate glass gas-washing bottle using a sintered glass gas diffuser at a flow rate of ~550 ml/min. In each batch experiment, the ozone doses were varied as a function of ozonation times which were 0, 2, 5, 10, 15, 20, 25^{*}, 30, 40, 50^{*}, 60, 100, 180 and 300^{**} s (^{*} specific for LP series and ^{**} specific for WWTP series). The residual O₃ concentrations in ozonated samples were immediately measured according to the standard indigo method (Bader and Hoigné 1981), where 1 mL of ozonated sample was immediately spiked into glass vials containing 9 mL indigo solution, and then analyzed for residual absorbance at 600 nm by UV-Vis spectroscopy. The remainder of the ozonated sample volumes was transferred into 250 mL glass bottles with caps. UVA and fluorescence indicators were measured at least 2 hours after ozonation, allowing the residual ozone to naturally decay without adding any quenching agent. Then the samples were stored at 4 °C before other analyses, which were done within 5 days for each batch.

Compared with directly spiking aliquots of ozone stock (Chon et al. 2015, Gerrity et al. 2012), the semi-batch ozonation experiment has no dilution effect on the samples, which facilitates the measurement of BDOC. However, the determination of ozone dose becomes another important issue, as the rate of ozone mass transferred into water phase may change as a function of time. As shown in **Figure S1**, the transferred/absorbed ozone concentrations as a function of time were calculated based on measurements of the differential O₃ concentrations between the feed gas and off-gas streams, where the gaseous O₃ concentrations were measured by the modified

indigo method (Chiou et al. 1995).

2.3. Batch biodegradation experiments

BDOC measurements were performed by quantifying the gross amount of DOC degraded by an inoculum of suspended activated sludge over a predetermined period of time (Escobar and Randall 2001). In this study, a requisite amount of activated sludge from a WWTP was initially acclimated with glucose for 3 days. The acclimated activated sludge was washed by centrifugation and resuspended in deionized water 5 times prior to harvesting for BDOC measurements. Then 50 mL centrifuge tubes were filled with 40 ml water samples and spiked with 1 mL of the harvested activated sludge. The BDOC tests were conducted in duplicate and compared with results obtained using Milli-Q water as a blank control. A 200 mg/L dry biomass concentration was used in the tests. This dose was determined by weighing the biomass collected from ten test tubes after BDOC experiments; the biomass was dried at 105 °C before weighing. The inoculated centrifuge tubes were placed in an incubated shaker at 90 rpm and 25 °C for a period of 4 hours, following which the samples were centrifuged and the supernatants filtered through a 0.45µm PTFE filter for subsequent DOC and molecular weight analysis. The measured BDOC reflects the rapidly biodegradable fraction of BDOC that can be effectively removed by biofiltration; this fraction is thus referred to as BDOC_{rapid} henceforth (Black and Berube 2014).

2.4. UV absorbance and fluorescence analysis

A HORIBA Aqualog spectrometer was used to simultaneously measure fluorescence EEM (Ex 220-450 nm / Em 245-825 nm) and UV absorbance spectra (220-450 nm). The samples' EEMs were automatically corrected for Raman scattering by subtracting the EEM of the water blank from the EEM of any surface water or wastewater sample. Inner filter effects were corrected using the instrument's software that utilized applicable absorbance data.

The prototype LED UV/fluorescence sensor described in more detail in (Li et al. 2016a) uses a UV LED (280 ± 5 nm) as a light source and a photodiode to measure the intensity of light passing the cuvette. For fluorescence detection, the sensor uses blue light sensitive photodiodes combined with bandpass filters (330-355 nm and 415-490 nm) positioned at 90° relative to the excitation beam to detect the protein-like and humic-like fluorescence, respectively. Inner filter effects in fluorescence signals detected by the sensor were corrected using the UVA280 values.

2.5. Molecular weight analysis

Analyses of DOC molecular weight distributions were performed by means of size exclusion chromatography with online carbon detection (SEC-OCD). These measurements utilized a DIONEX Ultimate3000 high-pressure liquid chromatography (HPLC) system coupled with an online organic carbon detector (Turbo Sievers 900 Portable TOC Analyzer, GE). A TOSOH Bioscience Toyopearl HW-50S size exclusion column was installed to separate DOM components with varying apparent MWs. The injection volume was 100 μ L, and the column was eluted with 1 mL/min

phosphate buffer ($1.5 \text{ g/L Na}_2\text{HPO}_4 \cdot 2 \text{ H}_2\text{O} + 2.5 \text{ g/L KH}_2\text{PO}_4$). Polyethylene glycol standards (PEG 20 kDa, 10 kDa, 6 kDa, 4 kDa, 1.5 kDa, 600 Da and 200 Da) from Alfa Aesar were used as apparent molecular weight (AMW) references. The SEC-OCD chromatograms for samples from each ozonation experiment were also processed with Shige software developed by Noda and Ozaki (2005) for 2D correlation analysis – the goal of which was to ascertain potentially small variations of various spectra resulting from external perturbations, e.g., DOM ozonation in this study (supporting information **Figure S4**).

2.6. Bromide and bromate Analysis

Bromide concentrations were determined by means of IC-ICP-MS, using a PerkinElmer Series 200 HPLC coupled with a PerkinElmer SCIEX ELAN DRC-e ICP/MS Spectrometer. These analyses were done in accord with prior investigators (Shi and Adams 2009).

Bromate concentrations were determined by means of ion chromatography with MS/MS detection, using a Shimadzu Prominence LC-20 series HPLC system coupled with an API 4000 QTrap hybrid triple quadrupole/linear ion trap mass spectrometer (AB SCIEX) operating with negative mode electrospray ionization. Separations were performed using an ion exchange column ($2 \times 250 \text{ mm}$ Dionex IonPac AS-16 w/ $2 \times 50 \text{ mm}$ AG-16 guard column) under isocratic conditions, with a mobile phase comprising 20% of a 1 mol/L aqueous methylamine solution and 80% of acetonitrile, at a flow rate of 0.25 mL/min and injection volume of 100 μL . The mass parameters

used in multiple reaction monitoring mode for BrO_3^- identification and quantification were 128.9→113.0 and 126.9→110.8. Method detection and quantification limits for BrO_3^- were 0.03 and 0.1 $\mu\text{g/L}$, respectively.

3. Results and discussion

3.1. Degradation of chromophores

Absorbance spectra of water and wastewater ozonated at varying O_3/DOC ratios normalized by the original samples' absorbance spectra are shown in **Figure 1** and **Figure S2**. At all wavelengths > 230 nm, these spectra showed a monotonic decrease of absorbance associated with the increase of ozone dosage. Consistent with previous results (Chon et al. 2015, Gerrity et al. 2012), the normalized absorbance spectra were relatively flat in the wavelength range >250 nm. The flat region in the normalized absorbance spectra could be separated into sub-ranges below ~ 350 nm and above ~ 370 nm. At low ozone doses ($\text{O}_3/\text{DOC} < 0.4$), the observed variations of the normalized absorbance at $\lambda < 350$ nm were less pronounced than those of the relative residual absorbance at $\lambda > 370$ nm, and such relationships then reversed at the higher O_3/DOC ratios. This phenomenon indicates that the chromophores comprise at least two kinetically distinct functionalities during ozonation (Nanaboina and Korshin 2010). Due to its relatively high absolute value, the UV absorbance in the range of 250-300 nm presents a more convenient option for online monitoring than absorbance at $\lambda > 300$ nm.

Figure 2 illustrates that UVA₂₅₄ and UVA₂₈₀ represented as a function of

O₃/DOC ratio or ozonation time exhibit similar changes. With the increase of O₃/DOC ratio, the UVA indices decreased steeply at low O₃/DOC ratios (< 0.5 mg O₃/mg DOC) and then decreased more gradually at higher O₃/DOC ratios. When presented vs. ozonation time, the normalized residual UVA indices decreased more steeply at the initial ozonation stage (< 40 s) and more gradually for longer ozonation times. This phenomenon could be explained by the contributions of kinetically different groups of chromophores and also changes of the ozone transfer rate which varied as a function of time (**Figure S1**). The O₃/DOC ratios related to such inflection points were in the range of 0.4-0.6 mg O₃/mg DOC. At these O₃/DOC ratios, UVA₂₅₄ and UVA₂₈₀ were decreased by about 45-60 %. Given that the observed changes of the absorbance of ozonated water were similar for the two examined wavelengths, it can be concluded that measurements at 280 nm – a practically implementable LED emission wavelength feasible for online applications – may represent an excellent alternative to UVA₂₅₄ measurements in the context of evaluation of ozonation efficiency as well as DBP formation during chlorination (Li et al. 2016a).

3.2. Degradation of fluorophores

Representative fluorescence excitation-emission matrixes (EEM) of untreated wastewater and surface water samples are shown in **Figure 3**. Generally, the fluorescence peaks with Em<380 nm are ascribed to protein-like fluorescence while the fluorescence peaks with Em>380 nm are ascribed to humic-like fluorescence associated with fluorophores comprising aromatic rings substituted with various

electron-donating functional groups (Barsotti et al. 2016, Li et al. 2013, Li et al. 2015).

The examined wastewater samples showed the presence of two protein-like fluorescence peaks ($E_m \sim 350$ nm) and two humic-like fluorescence peaks ($E_m \sim 430$ nm), while the EEM of Lake Pleasant water was dominated by two humic-like fluorescence peaks ($E_m \sim 450$ nm). The comparison of the fluorescence data obtained with the LED sensor and the lab benchtop spectrometer (**Table S1**) indicates a very good convergence of these results and thus confirms the good sensitivity and accuracy of the LED sensor for use in online monitoring applications. However, the sensitivity of the LED sensor to humic-like fluorescence is much higher than to protein-like fluorescence, mainly due to the fluorescence integration area, the transmittance efficiency of the sensor's bandpass filter, and the response sensitivity of photodiodes to UV light. Due to the relatively weak contribution of protein-like fluorescence in Lake Pleasant samples, measurements of humic-like fluorescence are mainly discussed hereafter.

Figure 4 illustrates the degradation of humic-like fluorophores during ozonation. The humic-like fluorescence decreased very steeply at the initial stage of ozonation time (< 25 s) and then reached to a distinguishable flat region at high ozone time. Like for UVA₂₅₄ and UVA₂₈₀, the decrease of humic-like fluorescence as a function of O_3/DOC ratio could also be divided into two stages; however, more than 80% of the humic-like fluorescence was lost in the initial stage – much higher than for the UVA indices. The O_3/DOC ratios related to such inflection points between these two stages

were in the range of 0.3-0.4.

3.3. Formation of BDOC

Figure 5a presents the formation of $\text{BDOC}_{\text{rapid}}$ as a function of O_3/DOC ratio or ozonation time. These data demonstrate that the formation of $\text{BDOC}_{\text{rapid}}$ increased gradually at O_3/DOC ratios < 0.4 and while it increased more steeply for O_3/DOC ratios 0.4-0.7. Above the latter transitional range of O_3/DOC ratios, $\text{BDOC}_{\text{rapid}}$ formation leveled off with distinguishable plateaus at higher O_3/DOC ratios, suggesting that the remaining DOM is relatively refractory and requires more O_3 to be converted to the biodegradable form. Similar patterns of BDOC formation at low O_3 doses were observed in prior studies. For instance, Win et al. (2000) found that the biodegradability of DOM was not appreciably affected by ozonation until a threshold of ozone dose was reached. Liu et al. (2015) reported that there was no significant formation of aldehydes and carboxylic acids that comprise a large part of the assimilable organic carbon (AOC) in ozonated wastewater (DOC 7.8 mg/L) with O_3 dose less than 2 mg/L. The plateau in $\text{BDOC}_{\text{rapid}}$ formation at higher O_3/DOC ratios is also consistent with prior observations (Siddiqui et al. 1997, Treguer et al. 2010). When represented as a function of the decrease of UV absorbance and fluorescence (**Figure 5b&c**), the $\text{BDOC}_{\text{rapid}}$ concentrations increased slowly in the initial stage and then rose more noticeably. The inflection points in these plots corresponding to the decrease of UVA indices and fluorescence were close to 35-45%, and 75-85%, respectively.

The degradation of DOM during ozonation can occur through either direct

reaction with O₃, or with [•]OH radical generated during O₃ decomposition (von Gunten 2003a, Wert et al. 2009). During the initial ozone demand stage (**Figure S3**), ozone reacts directly and selectively with electron-rich moieties, e.g., aromatic chromophores or fluorophores (Chon et al. 2015, Wert et al. 2009, Wu et al. 2016), resulting in the rapid decreases of UV absorbance and fluorescence signals (**Figure 2** and **Figure 4**). Prior research based on ozonation experiments (DOC 1.2-1.4 mg/L, O₃ 2 mg/L) performed with and without [•]OH scavengers confirmed that direct ozone reactions are mainly responsible for the formation of small organic compounds contributing to AOC during the initial ozone demand stage (Hammes et al. 2006). However, such AOC molecules might not be produced substantially at very low ozone dose (Liu et al. 2015). In the present work, it is possible that the initial selective attacks of O₃ on electron-rich moieties were not sufficient to break down the large MW DOM fractions into small molecules associated with AOC, leading to the apparent lag in formation of BDOC_{rapid} at O₃/DOC ratios < 0.4. The presence of small quantities of inorganic constituents that might exert rapid O₃ demand at low O₃ doses (e.g., NO₂⁻) also cannot be ruled out. With greater O₃ doses, increasing exposure to O₃ and [•]OH may have led to more extensive breakdown of aromatic structures and other electron-rich targets through direct reactions with O₃ and indirect reactions involving the much less selective [•]OH (Legrini et al. 1993, von Gunten 2003a). At O₃/DOC ratios above 0.4-0.7, the observed decrease in formation of BDOC_{rapid} may be attributable to accumulation of more O₃- and [•]OH-recalcitrant products (e.g., acetic and oxalic acids) (Hammes et al. 2006, Ramseier and Gunten 2009). The synergistic

effect of O_3 and $\cdot OH$ radical contributed to the sufficient decomposition of large MW DOM and the prominent formation of AOCs.

3.4. Evolution of DOM molecular weight during ozonation

Figure 6 shows the evolution of SEC-OCD chromatograms of WWTP effluent and Lake Pleasant water during ozonation. In SEC experiments, DOM fractions with higher apparent MW have lower elution times (**Figure S4**). Using peak assignments introduced in prior research (Huber et al. 2011) to denote major features observed in the data shown in **Figure 6**, both WWTP effluent and Lake Pleasant water had a biopolymer-like peak of large AMW (peak a1 and peak b1, 20-30 min, AMW > 20 kDa). The WWTP effluent exhibited several peaks in the medium AMW range (peak a2, humic-like peak, 30-36 min, AMW of 14-5.5 kDa; peak a3, peak of building blocks, 36-40 min, AMW of 5.5-3 kDa) and two well-resolved peaks located at lower AMW values (peak a4, peak of low MW acids, 40-48 min, AMW of 3-0.8 kDa; peak a5, peak of low MW neutrals, 50-60 min, AMW < 800 Da). SEC-OCD data for Lake Pleasant water exhibited a prominent peak b2 (humic-like peak, 28-36 min, AMW of 20-5.5 kDa) with a shoulder b3 (building blocks, 36-40 min, AMW of 5.5-3 kDa). These peaks located in the range of medium AMW typically attributed to humic substances were responsible for a large portion of DOC in untreated Lake Pleasant water. The SEC-OCD of Lake Pleasant water also had two weaker peaks located in the range of small AMW (peak b4 and peak b5), which are designated as low MW acids and neutrals.

The evolution of apparent DOM molecular weights is indicated by the red arrows in **Figure 6**. It is also visualized using 2D synchronous correlation contours (**Figure S5**). At increasing ozone dosages, the large MW biopolymer-like peaks (a1 and b1) and medium MW humic-like peaks (a2 and b2) decreased while the concentration of building blocks and low MW acids and neutrals increased, suggesting that the larger AMW DOM components were transformed into smaller AMW species during ozonation. The newly formed medium building blocks and small MW DOM species were easily biodegraded and mainly contributed to the BDOC_{rapid} (**Figure S6**). The SEC-OCD results also confirmed that the decomposition of biopolymer-like or humic-like peaks was not prominent (<20%) during the initial ozonation stage, despite the substantial losses of UVA and fluorescence (**Figure S7**).

3.5. Formation of bromate

Figures 7a-b depict bromate yields (expressed as mol ratios of Br associated with BrO₃⁻ to initial Br⁻ ([BrO₃⁻]/[Br⁻], in % mol/mol) plotted as a function of O₃/DOC ratio or ozonation time. The observed relationships exhibit the presence of two phases of bromate formation, as marked by the dash line. During the initial phase (O₃/DOC ratios < 0.4 or ozonation time < 25 s), bromate yields were low ([BrO₃⁻]/[Br⁻] < 2 %) and effects of initial Br⁻ concentrations on this phase were minor. This is in agreement with the data of previous studies (Chon et al. 2015, Soltermann et al. 2016), which observed a negligible bromate yield (≤3%) for O₃/DOC ratios < 0.4-0.6 mg O₃/mg DOC.

This phenomenon can be ascribed to specific features of the formation pathway of bromate, which is generated via a complex mechanism involving ozone and hydroxyl radical (Fischbacher et al. 2015, von Gunten and Oliveras 1998). During the initial phase of bromate formation (O_3/DOC ratios < 0.4 , ozonation time < 25 s), O_3 is rapidly consumed by electron-rich moieties (Buffle et al. 2006, Lee et al. 2013) whose consumption is consistent with the rapid decrease of humic-like fluorescence (**Figure 4**), thus leaving little residual O_3 for reaction with Br^- (**Figure S3**). In the second phase, in which measured residual ozone concentrations exceeded 1 mg/L (**Figure S3**), bromide could be readily oxidized to bromate, with its yields increasing with the ozone doses, and different water matrixes had a significant effect on the bromate yields measured as a function of O_3/DOC ratio or ozonation time.

When plotted versus O_3/DOC ratio, the bromate formation across different water matrixes was similar for each matrix when presented in terms of bromate concentration in $\mu g/L$ (**Figure S8**), but different when represented in terms of bromate yield units (**Figure 7**). That is, the lower initial bromide concentration in Lake Pleasant water led to higher molar bromate yields compared to those for the higher-bromide WWTP effluent samples at the same ozone doses. Compared with the data of the previous study (Chon et al. 2015), the bromate formation yields of WWTP effluent samples at the corresponding O_3/DOC ratios in the present work were lower, possibly due to the higher initial Br^- concentrations in this study (Br^- 300-500 $\mu g/L$ for DOC 5.8-6.9 mg/L vs. Br^- 39-86 $\mu g/L$ for DOC 5.3-7.3 mg/L). Therefore, the O_3/DOC ratio might not always be an optimal indicator for estimation of bromate

formation across different water matrixes.

Figures 7c-d present the normalized bromate yields ($[\text{BrO}_3^-]/[\text{Br}^-]$, mol/mol) as a function of relative changes in the spectroscopic parameters UVA254, UVA280 and humic-like fluorescence. In agreement with one previous study (Chon et al. 2015), the plots of bromate yields vs. spectroscopic indicators overlapped for all data sets obtained in the ozonation experiments, although the DOM properties and initial Br^- concentrations were different. Similarly to the observations discussed above, changes in the bromate yields could be further divided into two stages characterized by significantly different slopes vs. corresponding spectroscopic index. The inflection points related to the appreciable formation of BrO_3^- were in the range of 45-55%, 50-60% and 86-92% losses of UVA254, UVA280, and humic-like fluorescence, respectively. Unlike O_3/DOC ratios, the plots of $[\text{BrO}_3^-]/[\text{Br}^-]$ as a function of the spectroscopic indicators in the second phase had relatively small differences for the data obtained for Lake Pleasant and WWTP effluent samples, suggesting that the spectroscopic indices may be more suitable as a surrogate parameter for bromate formation in waters of varying composition.

With respect to the US EPA's MCL for BrO_3^- in drinking water of 10 $\mu\text{g/L}$, the breakthrough points related to removals of UVA254, UVA280 and decrease of humic-like fluorescence were in the range of 45-55%, 52-57%, and 86-90%, respectively (**Figure 8**). In contrast to the observations made for $[\text{BrO}_3^-]/[\text{Br}^-]$ molar yields (**Figure 7**), plots of BrO_3^- vs UVA254 and BrO_3^- vs UVA280 diverged into distinct groups of data for WWTP effluents and Lake Pleasant. Such divergences

were presumably due to differences in initial Br^- concentrations in the various matrixes, since BrO_3^- yields were not normalized to initial Br^- levels in these plots. Additionally, chromophores in Lake Pleasant water appeared to be much more susceptible to the oxidation at higher O_3 exposures than chromophores in WWTP effluents (**Figure 2**). However, no significant divergences between the data for dissimilar water matrixes were observed in plots of BrO_3^- vs humic fluorescence. In comparison to the ~25% variation amongst UVA indices in the various matrixes at higher O_3 exposures, further decreases of humic-like fluorescence were limited in a narrow range from 90% to 100%. The association of this narrow range of changes of humic-like fluorescence with the generation of bromate is likely to have largely eliminated any divergence attributable to differences in initial Br^- concentration. A previous study also reported a sole correlation between a fluorescence index and several chlorinated DBPs regardless of the water source and treatment, while the differential absorbance correlations could be interfered by many species (Roccaro et al. 2009). These results showed that fluorescence indices may have more advantages than absorbance indices in actual water systems.

The plots of BrO_3^- concentration ($\mu\text{g/L}$) versus decrease of humic fluorescence (HS, in %) were fitted by MATLAB software (**Figure S9**), and an empirical equation applicable to the ranges of 6-7 mg/L DOC and 100-500 $\mu\text{g/L}$ Br^- was obtained, as presented below:

$$\text{BrO}_3^- (\mu\text{g/L}) = 7.64 * 10^{-9} * e^{0.237*HS(\%)} , R^2 = 0.962$$

The results of this study suggest that measurements of changes in humic-like fluorescence of ozonated water are highly suitable for the estimation of bromate formation in dissimilar water matrixes. The results in **Figure S10** further indicate that DOC concentration has relatively little effect on the relationships between bromate formation and humic-like fluorescence. However, the robustness of such relationships still needs to be explored in the future; for example, with respect to the effects of pH, temperature, DOC and NH_4^+ concentrations.

In the context of optimization of ozone dosage, the typical goal is to maximize the effect of oxidation while simultaneously minimizing the formation of undesired byproducts. Gerrity et al. (2012) previously reported that ~50% reduction of UVA254 or ~90% decrease of total fluorescence were required to reach acceptable levels of pathogen inactivation and sufficient elimination of many micropollutants. The present work supports these findings and demonstrates possible approaches for assessing the potential formation of BDOC and bromate during water and wastewater ozonation, especially for water having bromide concentrations above 50 $\mu\text{g/L}$.

4. Conclusions

- When represented as a function of changes of spectroscopic indicators such as UVA254, UVA280, and humic-like fluorescence, BDOC concentrations initially increased slowly and then rose more noticeably. The inflection points indicative of BDOC formation threshold were located in the range of 35-45% loss of UVA254 or UVA280 and 75-85% loss of humic-like fluorescence.

- SEC-OCD data showed that large biopolymer molecules in WWTP effluent (apparent MW>20 kDa) and medium-AMW humic substances in Lake Pleasant surface water (AMW 5.5-20 kDa) were transformed into medium-AMW building blocks and small AMW species associated with BDOC.
- When represented as a function of spectroscopic indicators, the inflection points that corresponded to the onset of bromate formation were approximately 45-55%, 50-60% and 86-92% for decreases in UVA254, UVA280 and humic fluorescence, respectively.
- An empirical equation modeling the relationship between bromate concentrations (expressed in $\mu\text{g/L}$) and concomitant decreases of humic-like fluorescence (%) was established based on the data generated for wastewater effluent and surface water that had 100 to 500 $\mu\text{g/L Br}^-$.
- The results suggest that measurements of UVA280 and humic-like fluorescence complement conventional UVA254 measurements, especially in the context of assessing the formation of BDOC and bromate. The use of these spectroscopic parameters is expected to be enhanced by the recent development of online/portable spectrometers that use LEDs as a light source.

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485 **Appendix A. Supplementary data**

486 Supplementary data related to this article can be found in Supporting Information.

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655

656 **Table 1. Basic characteristics of water matrixes**

Parameters	WWTP-I	WWTP-II	Lake Pleasant
pH	6.92	6.95	7.48 ^a
DOC (mg/L)	5.82	6.93	14.87
UV254 (cm⁻¹)	0.130	0.139	0.727
UV280 (cm⁻¹)	0.100	0.108	0.545
Conductivity (us/cm)	480	652	314
Br⁻ (µg/L) ^b	267.8	201.5	36.7

^a The pH values of 2.5 times diluted lake Pleasant water were about 7.

^b The values listed here are the native background Br⁻ concentrations for each water matrix. Initial Br⁻ concentrations during ozonation batch experiments, using samples of each water matrix fortified with additional bromide, were as follows: 322.9 µg/L for WWTP-A, 373.8 µg/L for WWTP-B, 491.6 µg/L for WWTP-C, 301.5 µg/L for WWTP-D, and 116.1 µg/L for LP.

Figure Captions

Figure 1. Changes in the absorbance spectra of WWTP effluent as a function of O_3/DOC ratio normalized by the absorbance prior to treatment

Figure 2. Decreases of the normalized residual UVA indices as a function of O_3/DOC ratio (or ozonation time – inserts): (a) UVA254 and (b) UVA280

Figure 3. EEM spectra of (a) WWTP-I, (b) WWTP-II, and (c) LP. The circles on the left of each graph represent protein-like fluorescence that the LED sensor measures, while the circles on the right of each graph represent humic-like fluorescence that the LED sensor measures.

Figure 4. Decrease of the normalized humic-like fluorescence (H/H_0) as a function of O_3/DOC ratio or ozonation time (insert) in different ozonation experiments

Figure 5. Formation of $BDOC_{rapid}$ as a function of (a) O_3/DOC ratio or ozonation time (insert), (b) decrease of UVA254 or UVA280 (insert) and (c) decrease of LED humic-like fluorescence

Figure 6. Evolution of SEC-OCD chromatograms of the ozonated wastewater and surface water as a function of O_3/DOC ratio : (a) WWTP-I effluent (WWTP-A) and (b) Lake Pleasant water (LP).

Figure 7. Bromate formation yields ($[BrO_3^-]/[Br^-]$, mol/mol in %) represented as a function of (a) O_3/DOC ratio, (b) ozonation time, (c) decrease of UVA254 or UVA280 (insert) and (d) decrease of LED humic-like fluorescence.

Figure 8. Bromate formation ($\mu g/L$) as a function of decreases of spectral indicators: (a) UVA254 or UVA280 (insert) and (b) LED humic-like fluorescence

Figure 1

Figure 2

Figure 3

Figure 4

Figure 5

Figure 6

Figure 7

Figure 8