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Byproduct formation in heterogeneous catalytic ozonation processes

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Heterogeneous catalytic ozonation (HCO) is a promising advanced oxidation process (AOP) that can effectively degrade recalcitrant organic pollutants. While research efforts have been mainly devoted to the development of different catalysts to enhance the process efficiency, more studies are needed to investigate and address the other challenge faced by AOPs, *i.e.* generation of harmful byproducts. Bromate is the major inorganic byproduct of concern when ozone is involved. While most studies have reported less bromate formation in HCO than ozonation alone, the effects of catalysts depend on their interaction with O_3 and the dominant bromate formation pathway (direct O_3 oxidation vs. indirect $\cdot OH$ oxidation) in the system. Production of H_2O_2 and cyclic redox reactions on the catalyst surface can also reduce different Br species leading to a lower bromate yield. Generation of organic byproducts (OBPs; *e.g.* aldehydes, keto-acids, carboxylic acids) in HCO depends on the reactivity of precursors (*e.g.* dissolved organic matter/DOM) and OBPs with $O_3/\cdot OH$, interactions between DOM/OBPs and catalysts, characteristics of DOM, and O_3 dose. HCO generally increased the removal of dissolved organic carbon (DOC) and the biodegradability of the bulk organics. HCO treatment may also decrease the formation potential of some disinfection byproducts (DBPs) such as trihalomethanes (THMs) and haloacetic acids (HAAs) but may increase the brominated species of the DBPs and also the formation potential of haloacetonitrile (HAN) under certain conditions. This review discusses the current status of studies on both organic and inorganic byproduct formation in HCO as well as transformation of bulk organics and the effects on DBP formation in the downstream disinfection process, and further provides recommendations for future research and development. A standardized experimental protocol and rigorous experimental design is important to deepen our understanding and gain insights on the byproduct formation in HCO from different studies collectively.

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Environmental significance

Heterogeneous catalytic ozonation (HCO), which does not require addition of other chemical agents and avoids the following separation step, can be an effective advanced oxidation process (AOP) for the abatement of organic pollutants. Since AOPs are generally considered energy intensive, research on HCO has been focusing on developing different catalysts to enhance the degradation efficiency of target pollutants. However, generation of harmful byproducts is another challenge of AOPs and more attention in this regard is needed to facilitate practical applications of newly developed processes. This paper aims to present a review of the up-to-date knowledge of both inorganic and organic byproduct formation in HCO and recommendations on future research.

1. Introduction

Ozone-based advanced oxidation processes (AOPs) usually involve agents that can promote ozone decomposition to initiate and propagate the formation of hydroxyl radical ($\cdot OH$) that is extremely reactive with organic compounds in water. One of the most commonly used chemical agents is hydrogen peroxide (H_2O_2),^{1–3} which, along with its storage and transportation, can represent substantial cost. Hence electroperoxone with *in situ* generation of H_2O_2 through O_2

reduction at carbon cathodes was also developed.^{4–7} On the other hand, transition metal ions such as Fe^{2+} , Cu^{2+} can be used as homogeneous catalysts for such a purpose but need to be separated from treated water.⁸ Reactive species can also be generated during O_3 decomposition in the presence of solid catalysts, *i.e.* heterogeneous catalytic ozonation (HCO), which does not require addition of other chemical agents and avoids the following separation step. Since conventional AOPs are considered energy intensive, investigation of novel AOPs including HCO often concentrates on enhancing process efficiencies for the removal of target pollutants, thus reducing the energy consumption. However, in addition to the intensive use of energy and chemicals, the risk of harmful by-products formation is another concern for AOPs and calls for more

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attention. It is worth emphasizing that, analogous to disinfection byproducts (DBPs) that are formed during reactions of disinfectants with naturally occurring organic matter (NOM) or inorganic species (*e.g.* halide anions) present in the water, here the byproducts refer to the unintended products formed due to the reaction of the co-existing species in the environmental matrices with oxidants in AOPs, not the transformation products of the target compound such as emerging contaminants.

Both inorganic and organic byproducts may be formed in AOPs. When ozone is involved, bromate (BrO_3^-), a probable human carcinogen, can be generated through the reaction of O_3/OH with naturally occurring Br^- , with HOBr/OBr^- being the critical intermediates.^{9–12} HCO has been reported to form less bromate than that of single ozonation in most studies but different mechanisms have been proposed.^{13–18} Such apparent discrepancies may arise from several causes: (1) the different catalysts used; (2) the different experimental conditions and experimental design employed; (3) the multiple possible pathways for bromate formation. While it is possible that the dominant mechanism is different in studies with different catalysts, it is worth mentioning that since HCO is a highly heterogeneous system, to understand the underlying mechanism and delineate the reaction pathways is a challenging task. The multiple species and pathways responsible for bromate formation, along with the possible interactions among them, certainly add more difficulties in reaching any convincing conclusions especially when a rigorous experimental design and comprehensive investigation is lacking. For example, very often the presence of catalysts accelerates O_3 decomposition and consequently OH generation. However, this has been used to explain completely opposite experimental observations, *i.e.*, inhibition and promotion of bromate formation, because both species (*i.e.* O_3 and OH) can contribute to the oxidation of bromide to bromate.^{10,11,19}

O_3 and OH can also react with NOM present in water, thus decreasing the efficiency of target contaminants' removal. When organic byproducts are concerned, attention should be paid to the "direct byproducts" as well as the transformation and changes of bulk organics because very likely this will affect the formation of DBPs in the downstream disinfection process. Ozonation may change the structure and biodegradability of NOM.^{20,21} Usually the transformation products are oxygenated compounds such as aldehydes, alcohols, ketones and carboxylic acids.^{22,23} These compounds react slowly with ozone and may accumulate as oxidation byproducts (OBPs) in the finishing water. When catalysts are used to promote the generation of OH , their removal can be increased,²⁴ but OH can also effectively oxidize the precursors leading to higher accumulation of some OBPs.²⁵ Furthermore, as complete mineralization usually cannot be achieved cost-effectively, transformation products of the organic matters may form disinfection byproducts in the following disinfection process. Studies on the DBPs formation by chlorination and ozonation/postchlorination treatment indicated ozonated/postchlorinated water had lower concentrations of total organic halogen, trihalomethanes (THMs), haloacetic acids (HAAs), and higher concentrations of bromate, and aldehydes.²⁶ However, higher DBP concentrations were

reported in water pretreated with electro-peroxone than that pretreated with ozonation because the major precursors, NOM with high UV_{254} absorbance, were more efficiently removed in ozonation.⁷ Since both peroxone and HCO involve agents (*i.e.* H_2O_2 and catalysts respectively) to promote ozone decomposition, these results indicate that evaluation and optimization of HCO should concentrate on not only abatement of the target pollutants, but also transformation of background organic content. Moreover, co-existence of organic and inorganic precursors can further affect the formation of byproducts (*e.g.* bromate, halogenated organics) as well as the species distribution of DBPs.^{27,28} Although there have been some reports on NOM transformation and subsequent DBP formation in the literature (which are reviewed in Section 3), HCO studies have been more focusing on developing different catalysts that can effectively improve the process efficiency for the destruction of recalcitrant organic pollutants.²⁹

Hence, this tutorial review aims to discuss the current status of studies on byproduct formation and transformation of bulk organics in HCO processes and further provide recommendations for future research and development.

2. Formation of inorganic byproducts in HCO

Toxic oxyanions (*e.g.* bromate, chlorate, and perchlorate) may be produced during oxidation processes in the presence of some inorganic ions especially halides. For ozone-based AOPs, bromate is a characteristic inorganic byproduct which is regulated at $10 \mu\text{g L}^{-1}$ in drinking water in several countries.³⁰ Since the bromide level in natural waters varies from $\sim 10 \mu\text{g L}^{-1}$ to $>1000 \mu\text{g L}^{-1}$ in fresh waters,³¹ formation of bromate during water treatment is practically relevant and thus has been studied in various oxidation processes including heterogeneous catalytic ozonation. On the other hand, chloride is ubiquitous in the environment and commonly exists at mg L^{-1} level in natural waters, with chlorate and perchlorate being two possible oxidation byproducts of concern. The yield and rate of formation of these harmful oxyanions in ozonation processes depends on the chemical conditions (*e.g.* pH, DOC), doses, and most importantly, the aqueous Cl species (*e.g.* Cl^- , HOCl/OCl^- , ClO_2^- *etc.*).³² While reactions between chlorine (HOCl/OCl^-) and ozone *via* free radical pathways can lead to the formation of chlorate in low-DOC water, the very slow rate of perchlorate production from Cl^- even at high concentrations of O_3 and Cl^- implies negligible potential of perchlorate formation in water/wastewater treatment processes involving ozone.³³ This is because O_3 interacts with Cl^- very slowly ($k = 2.2 \times 10^{-3} \text{ M}^{-1} \text{ s}^{-1}$ at 20°C , $\text{pH} > 3$) to produce OCl^- for chlorate and perchlorate generation.³⁴ Although OH may react with Cl^- and lead to the Cl_2OH^- intermediate for chlorate formation, the product (ClOH^-) of the starting reaction has a high dissociation rate constant ($\text{Cl}^- + \text{OH} \leftrightarrow \text{ClOH}^-$, $k_f = 4.3 \times 10^9 \text{ M}^{-1} \text{ s}^{-1}$, $k_r = 6.1 \times 10^9 \text{ M}^{-1} \text{ s}^{-1}$),³⁵ resulting in limited chlorate production under water/wastewater relevant conditions (*e.g.* many species competing for OH and low Cl^- level). Hence, when O_3 -based AOPs are used



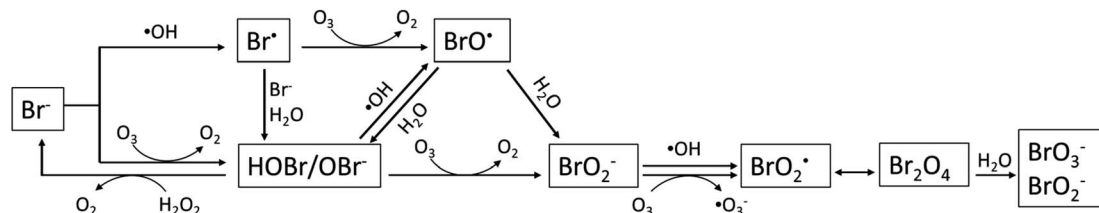


Fig. 1 Reaction pathways for bromate formation during ozone-based AOPs (adapted from Fischbacher *et al.*, 2015;¹⁹ Von Gunten and Hoigne, 1994;¹⁰ von Gunten and Oliveras, 1998.¹¹

for the removal of recalcitrant organic pollutants in the absence of active Cl species such as HOCl/OCl⁻ (*e.g.* before disinfection), formation of chlorate and perchlorate is unlikely a big concern. Because of this and also because of the less regulation pressure, chlorate/perchlorate has drawn much less attention compared to bromate as an ozonation byproduct. To the author's knowledge, there is no report on chlorate/perchlorate formation in HCO yet. Moreover, while it can be formed during ozonation of iodide-containing water, iodate is considered non-problematic because it is reduced back to iodide endogenically. Therefore, this review focuses on bromate.

2.1 Overview of bromate formation in ozone-based processes

Bromate is a long-known byproduct of oxidative treatment of bromide containing water and its formation has been intensively studied since early 1990s. Fig. 1 shows the formation pathways of bromate in the reaction of bromide with ozone and hydroxyl radicals. It was originally proposed by von Gunten *et al.* and later revised by Fischbacher *et al.*, where the last reaction between ozone and bromite was recommended to be *via* electron transfer instead of the previously assumed O transfer.^{10,11,19} The pathways/reactions which have been suggested to influence the bromate formation in HCO are discussed in details in the following sections and illustrated in Fig. 2. The related studies are summarized in Table 1.

2.2 Bromate formation in HCO

While most relevant studies have reported less bromate formation in HCO compared with ozonation alone under similar conditions, there are a few exceptions.^{17,36} In general, addition of heterogeneous catalysts may affect bromate formation due to one or several of the following reasons (Fig. 2).

2.2.1 Dissolved ozone (DO₃) decomposition. As shown in Fig. 1, bromate may be formed *via* both O₃ and •OH reaction pathways. The presence of solid catalysts usually promotes the decomposition of aqueous ozone with •OH being one of the main reactive oxygen species (ROS) frequently generated. The combination of these facts provides possible explanations, unfortunately, to both promotion and inhibition of bromate in HCO. First, accelerated DO₃ decomposition can suppress initial oxidation of Br⁻ to HOBr/OBr⁻ by O₃, resulting in less bromate formation during HCO. This has been proposed as one of the inhibition mechanisms by several studies.^{14,30,37-41} In contrast, increased O₃ decomposition and the consequent enhanced yield of •OH have been reported to lead to higher bromate formation.^{17,36} This apparent "discrepancy" may be ascribed to the different dominant mechanism (*e.g.* O₃ dominant or •OH dominant) in different systems which is influenced by the matrix chemistry (*e.g.* pH, co-existing species) and operating conditions (*e.g.* catalyst and O₃ dose), generation of radical species other than •OH, specific interactions between O₃ and



Fig. 2 Formation and inhibition of bromate in HCO processes.



Table 1 Summary of formation and inhibition of bromate in HCO processes

Catalyst	Experimental conditions	Results/mechanism	Ref.
Fe-Cu-MCM-41/Fe-MCM-41/Cu-MCM-41	Semi-batch reactor; catalyst: 1 g L; $[Br^-]_0$: 1000 $\mu\text{g L}^{-1}$, initial pH: 5.0	HCO inhibited bromate formation: (1) quick O_3 decomposition led to less O_3 exposure; (2) high $\cdot\text{OH}$ generation caused more bromate formation using Fe-Cu-MCM-41 than Fe-MCM-41 or Cu-MCM-41	39
Fe-Cu-MCM-41	Semi-batch reactor; catalyst: 1 g L; $[Br^-]_0$: 1000 $\mu\text{g L}^{-1}$, initial pH: 6.8	HCO inhibited bromate formation: (1) quick O_3 decomposition led to less O_3 exposure; (2) H_2O_2 was generated and reduced HOBr/OBr $^-$	40
Fe-Al LDH/Al $_2$ O $_3$	Batch reactor; $[O_3]_0$: 2 mg L; $[Br^-]_0$: 1.25 $\mu\text{mol L}^{-1}$; [2,4-dichlorophenoxyacetic acid] $_0$ ([2,4-D] $_0$): 45.2 $\mu\text{mol L}^{-1}$; catalyst: 0.25 g L; initial pH: 6	HCO with Fe-Al LDH/Al $_2$ O $_3$ was more efficient in bromate inhibition and pollutant removal: reduction of bromate by surface Fe(II), which was generated from the reaction between Fe(III)-intermediates complex and HO $_2^{\cdot-}$ / O_2^-	13
β -FeOOH/Al $_2$ O $_3$	Batch reactor; $[O_3]_0$: 2 mg L; $[Br^-]_0$: 1.25 $\mu\text{mol L}^{-1}$; [pollutant] $_0$: 45.2 $\mu\text{mol L}^{-1}$; catalyst: 0.25 g L; pH: 6	No significant bromate formation and higher removal of TOC were observed during HCO of the model pollutants except AMT: (1) adsorbed bromate was reduced to Br $^-$ by surface Fe(II), which was generated from reactions between Fe(III) and HO $_2^{\cdot-}$ / O_2^- ; (2) complexation of surface Fe(III) with O-containing functional groups of pollutants and their transformation products enhanced surface Fe(II) generation, resulting in higher bromate reduction	50
Faceted CeO $_2$ [(1 0 0), (1 1 0), and (1 1 1)]	Batch reactor; $[O_3]_0$: 4 mg L; $[Br^-]_0$: 2 mg L; sulfamethoxazole: 10 mg L; catalyst: 0.25–0.5 g L; initial pH: 6.3	Faceted CeO $_2$ inhibited bromate formation and enhanced the pollutant removal: (1) promoted O_3 decomposition; (2) less H_2O_2 generated in the presence of catalysts; (3) more $\cdot O_2^-$ generated in the presence of CeO $_2$ (1 0 0), which reduced Ce $^{4+}$ to Ce $^{3+}$ and Ce $^{3+}$ reduced different Br species	37
CeO $_2$	Batch reactor; $[O_3]_0$: 5.21 mg L; $[Br^-]_0$: 1.8 mg L; catalyst: 0.1 g L; initial pH: 6.3	The low lattice O and adsorbed O of CeO $_2$ promoted the adsorption of O-containing intermediates (from O_3 decomposition) on the active sites and inhibited $\cdot\text{OH}$ generation in solution and consequent bromate formation; inhibition of $\cdot\text{OH}$ generation also led to less organic degradation	17
CeO $_2$	Batch reactor; $[O_3]_0$: 4.51 mg L; $[Br^-]_0$: 2.0 mg L; catalyst: 0.1 g L; initial pH: 6.2	CeO $_2$ minimized bromate formation possibly due to lower H_2O_2 formation and reduction of BrO $^{\cdot}$ to HOBr/OBr $^-$ during H_2O_2 decomposition	18
Ce-MCM-48	Batch reactor; $[O_3]_0$: 2 mg L; $[Br^-]_0$: 1 mg L; catalyst: 0.5 g L; initial pH: 7.5	Ce $_{66}$ -MCM-48 inhibited bromate formation: (1) promoted O_3 decomposition to generate $\cdot\text{OH}$ thus suppressing initial oxidation of Br $^-$ to HOBr/OBr $^-$; (2) $\cdot\text{OH}$ may form H_2O_2 which reacted with $\cdot\text{OH}$ and O_3 ; (3) circulating reactions between Ce $^{4+}$ to Ce $^{3+}$ inhibited the oxidation of Br $^-$ and HOBr/OBr $^-$ Ce $^{3+}$ on CeO $_2$ /rGO quenched Br $^{\cdot}$ and BrO $^{\cdot}$; and inhibited bromate formation	30
CeO $_2$ /rGO	Semi-batch reactor; $[O_3]_0$: 10 mg (L^{-1} min); $[Br^-]_0$: 12.5 μM ; catalyst: 0.02 g L; pH 7 with 10 mM PBS	Ce $^{3+}$ on CeO $_2$ /rGO quenched Br $^{\cdot}$ and BrO $^{\cdot}$; and inhibited bromate formation	36
Lattice O-rich MnOOH	Semi-batch reactor; catalyst: 0.1 g L; Br $^-$: 1.1 mg L; 4-nitrophenol (4-NP): 20 mg L^{-1}	HCO with MnOOH inhibited bromate formation and boosted 4-NP degradation: (1) accelerated O_3 decomposition and decreased DO $_3$; (2) O_3 decomposition led to generation of $\cdot O_2^-$ instead of $\cdot\text{OH}$; (3) direct reduction of formed bromate by the catalyst	38
MnO $_x$ /Al $_2$ O $_3$	Batch reactor; $[O_3]_0$: 2 mg L; $[Br^-]_0$: 100 $\mu\text{g L}$; [2,4-D] $_0$: 10 mg L^{-1} ; catalyst: 0.25 g L; initial pH: 6.5	MnO $_x$ /Al $_2$ O $_3$ exhibited inhibition of bromate formation and efficient catalytic ozonation of 2,4-D: reduction of HOBr and bromate was facilitated by redox reactions between Mn $^{2+}$ /Mn $^{3+}$ /Mn $^{4+}$	49
Nano-TiO $_2$	Batch reactor; $[O_3]_0$: 3.38 mg L; $[Br^-]_0$: 0.4 mg L; catalyst: 0.1 g L; initial pH: 6.0	The catalysts accelerated O_3 decomposition into $\cdot\text{OH}$ and generated H $_2$ O $_2$ which reduced HOBr/OBr $^-$ to Br $^-$	14
H $^+$ -form high silica zeolite (HZSM-5)	Batch reactor; $[O_3]_0$: 1.3 mg L; $[Br^-]_0$: 300 $\mu\text{g L}$; catalyst: 1 g L; filtered surface water with pH 8.0 & [DOC] $_0$: 1.4 mg L^{-1}	HZSM-5 reduced bromate formation was possibly ascribed to the selective OBr $^-$ adsorption and the inhibited formation of H $_2$ O $_2$	43



Table 1 (Contd.)

Catalyst	Experimental conditions	Results/mechanism	Ref.
LaCoO ₃ & LaFeO ₃	Semi-batch reactor; [Br ⁻] ₀ : 100 µg L; [BZA] ₀ : 10 m L; catalyst: 0.5 g L; initial pH: 6.4	LaCoO ₃ exhibited catalytic activity for BZA degradation and inhibited bromate formation: (1) produced [•] OH and accelerated BZA degradation; (2) production of HO ₂ ⁻ /O ₂ ⁻ led to more H ₂ O ₂ generation, contributing to the reduction of bromate to HOBr/OBr ⁻ ; (3) cyclic reaction of Co ³⁺ /Co ⁴⁺ facilitated O ₃ decomposition and accelerated the above reactions. LaFeO ₃ exhibited no catalytic activity for BZA degradation but inhibited bromate formation: (1) didn't accelerate ROS production; (2) surface -OH combined with generated H ₂ O ₂ to form Fe-H ₂ O ₂ which reduced bromate to HOBr/OBr ⁻ easily	42
g-C ₃ N ₄	Semi-batch reactor; [Br ⁻] ₀ : 100 µg L; [pollutant] ₀ ^b : 0.084 mM; catalyst: 0.25 g L; initial pH: 4.75 for <i>p</i> -CBA solution and 6.01 for BZA solution	g-C ₃ N ₄ inhibited bromate formation due to the formation of H ₂ O ₂	44
Heteroatom-doped GO	Semi-batch reactor; [Br ⁻] ₀ : 100 µg L; [pollutant] ₀ ^b : 0.084 mM; catalyst: 0.25 g L; initial pH: 4.75 for <i>p</i> -CBA solution and 6.01 for BZA solution	Bromate elimination followed the order N-rGO > P-rGO > B-rGO > rGO > S-rGO: formation of H ₂ O ₂ favored bromate elimination	45

^a 2,4-Dichlorophenoxyacetic acid (2,4-D), phenazone (PZ), diphenhydramine (DP), amitrole (AMT). ^b Benzotriazole (BZA), 4-chlorobenzoic acid (*p*-CBA).

catalyst, and other mechanisms that affects bromate formation (see Sections 2.2.2 and 2.2.3). For example, while catalytic decomposition of O₃ can lead to enhanced production of [•]OH, as a non-selective oxidant [•]OH can be competitively consumed by co-existing organic compounds and not all involved in the oxidation of bromide.^{15,36} It can also form H₂O₂, which may either further react with O₃ and [•]OH (thus inhibiting both pathways)³⁰ or reduce HOBr/OBr⁻ to Br⁻ (Section 2.2.2).^{14,40} On the other hand, [•]OH is not always the dominant reactive species generated in HCO. In their study of catalytic ozonation with lattice oxygen-rich MnOOH nanorods, Huang *et al.* found O₃ was quickly transformed to [•]O₂⁻ instead of [•]OH. [•]O₂⁻ may reduce surface Mn(IV) to surface transient Mn(II)/Mn(III), which can then reduce bromate and other Br-intermediate species (HOBr/OBr⁻, Br[•], BrO[•] and BrO₂ in Fig. 1) to bromide.³⁸ Moreover, Wang *et al.* also proposed a bromate inhibition mechanism in the O₃/CeO₂ system where CeO₂ promoted the adsorption of O₃ and O₂-containing species, resulting in the inhibition of O₃ decomposition into [•]OH and consequent bromate formation.¹⁷ Results reported in the literature indicate a universal mechanism is unlikely to exist and an in-depth and thorough investigation is needed to truly understand the impact of less O₃ exposure caused by the presence of catalysts on bromate formation.

2.2.2 H₂O₂ production. H₂O₂ is often added in O₃ based AOPs to promote the production of ROS. Its generation and consequent effects on bromate formation were also investigated in several HCO studies.^{14,18,37,40,42-45} In the neutral pH range, H₂O₂ and HOBr reacts very slowly but HOBr/OBr⁻ can be rapidly reduced to Br⁻ by HO₂⁻ (H₂O₂ ↔ HO₂⁻ + H⁺).¹¹ Moreover, since H₂O₂ can accelerate O₃ decomposition leading to [•]OH generation and the overall oxidant budget (*i.e.* both O₃ and [•]OH) in the reaction system determines the bromate formation, for a given O₃ dose there is a threshold of H₂O₂ concentration at which the optimum synergistic effect of O₃ and [•]OH with respect to bromate formation is achieved.¹⁰ This threshold is usually close to a H₂O₂/O₃ molar ratio of 0.5 with the specific value determined by the chemical conditions of the system.^{10,42} When H₂O₂ concentration is lower than the threshold, the higher the concentration the more bromate is formed. Therefore, in several HCO studies where the H₂O₂/O₃ molar ratio was much lower than 0.5, one proposed mechanism for the inhibition of bromate formation was that less H₂O₂ was generated in the presence of solid catalysts than in ozonation alone.^{18,37,43} In contrast, higher H₂O₂ production (H₂O₂/O₃ molar ratio ~0.35 to 1) was detected in catalytic ozonation with reduced GO (rGO) and heteroatom-doped graphene (N-, P-, B-, and S-doped rGO) as the catalysts than in sole ozonation, which was considered to contribute to bromate elimination.^{44,45} It should be pointed out that the probe organic compound may also affect the profile of bromate formation. For example, higher yield of bromate was observed when *p*-chlorobenzoic acid (*p*-CBA) was used as the probe than benzotriazole (BZA) under otherwise same conditions,^{44,45} which may be partially because H₂O₂ can be produced during reactions between O₃ and organic compounds containing benzene rings or olefinic bonds.⁴⁶ In water treatment, such effect caused by micropollutants is unlikely to be significant due



to the trace level, and the characteristics of the bulk organics (*i.e.* dissolved organic matter/DOM) should play a dominant role in this regard, which can compete with Br^- for the oxidants and may also promote H_2O_2 generation.

2.2.3 Redox reactions on the catalyst surface. In heterogeneous catalytic ozonation processes, the catalytic activity is often realized through cyclic redox reactions on the surface of catalysts facilitated by the multivalent metal present in the catalysts (*e.g.* Ce, Mn, and Fe). Different intermediate bromine species may also involve in these redox reactions, which eventually affects bromate formation. For example, it was reported that Ce(III) can reduce Br^\cdot and BrO^\cdot to HOBr and Br^- respectively and form Ce(IV), while Fenton-like reactions can be catalyzed in the presence of H_2O_2 by circulating reactions between Ce(III) and Ce(IV).^{47,48} Hence, reduction/quenching of $\text{Br}^\cdot/\text{BrO}^\cdot$ by Ce(III) was proposed as one of the inhibition mechanisms for bromate formation in several HCO studies using Ce based catalysts.^{18,30,36} Moreover, Chen *et al.* investigated pollutant degradation and bromate inhibition by faceted CeO_2 catalyzed ozonation recently.³⁷ $\text{CeO}_2(100)$ exhibited the overall best catalytic activity towards pollutant removal as well as great bromate inhibition. More $\cdot\text{O}_2^-$ was generated in the presence of $\text{CeO}_2(100)$ and reduced Ce(IV) to Ce(III), which can subsequently reduce various bromine species including $\text{Br}^\cdot/\text{BrO}^\cdot$, HOBr/OBr^- , and BrO_3^- . MnO_x is another catalyst commonly used in HCO processes. Nie *et al.* reported that the reduction of BrO_3^- and HOBr was responsible for the inhibition of bromate formation over $\text{MnO}_x/\text{Al}_2\text{O}_3$ with ozone, which was facilitated by the interfacial electron transfer between $\text{Mn}^{2+}/\text{Mn}^{3+}/\text{Mn}^{4+}$.⁴⁹ In the study of catalytic ozonation of bromide-containing water with organic pollutants using lattice oxygen-rich MnOOH nanorods, the authors concluded that high-mobility surface lattice oxygen of MnOOH and $\cdot\text{O}_2^-$ generated during O_3 decomposition can transform Mn(IV) to the transient-reductive-state $^*\text{Mn(III)}/^*\text{Mn(II)}$ which can then reduce bromate and bromine-containing intermediates to bromide *via* electron transfer, thus completing the catalytic redox cycle of $\text{Mn(IV)} \rightarrow \text{Mn(III)}/\text{Mn(II)} \rightarrow \text{Mn(IV)}$.³⁸ When iron-based catalysts (*e.g.* Fe–Al LDH/ Al_2O_3 , $\beta\text{-FeOOH}/\text{Al}_2\text{O}_3$) were used, it was reported that BrO_3^- reduction by surface Fe(II) was responsible for the inhibition of bromate formation, where Fe(II) was generated from the reaction between Fe(III) and $\text{HO}_2^\cdot/\cdot\text{O}_2^-$. Further, complexation of Fe(III) with O-containing functional groups of organics decreased Fe(III)/Fe(II) redox potential and enhanced surface Fe(II) generation. Therefore, bromate reduction rate depended on the organics and their transformation products present.^{13,50} In their study of catalytic ozonation of benzotriazole (BZA) in the presence of bromide, Zhang *et al.* found LaFeO_3 did not accelerate ROS production or BZA degradation, but inhibited bromate generation.⁴² It was further proposed that surface $-\text{OH}$ complexed with H_2O_2 generated during BZA degradation to form surface complex of $[\text{Fe}-\text{H}_2\text{O}_2]_s$, and this complexation facilitated the reduction of BrO_3^- to HOBr/OBr^- by H_2O_2 . Interestingly, another perovskite oxide, LaCoO_3 , tested in the same study was found to promote the $\cdot\text{OH}$ production and BZA degradation, and also inhibit bromate formation. Production of $\text{HO}_2^\cdot/\cdot\text{O}_2^-$ led to more H_2O_2 generation, which was believed to contribute to the reduction of

BrO_3^- to HOBr/OBr^- , while the cyclic reaction of $\text{Co}^{3+}/\text{Co}^{4+}$ facilitated O_3 decomposition and accelerated the above reactions.⁴² However, it is worth mentioning that water matrix may affect the above-mentioned reduction pathways. In their following study, Zhang *et al.* reported worse bromate reduction during catalytic ozonation of BZA in mixed primary/secondary effluent using LaCoO_3 than in BZA solutions, due to the consumption of H_2O_2 and surface $-\text{OH}$ by effluent organic matter (EfOM) and inorganic anions in the matrix, respectively.²⁷ While it is rational to conduct the initial mechanistic investigation in a clean matrix, these results underline the importance and necessity of further evaluation in environmental waters.

3. Formation of organic byproducts and transformation of bulk organics in HCO

While AOPs including HCO often target at recalcitrant organic pollutants which usually exist at very low concentrations in environmental waters, oxidation of bulk organics (*e.g.* DOM and EfOM) is also unavoidable in these processes especially when non-selective oxidants (*e.g.* $\cdot\text{OH}$) are generated. Hence the transformation of bulk organics and formation of organic byproducts are also of great importance as they may affect the treated water quality as well as the formation of DBPs in the following disinfection process. Hence, in this review direct formation of organic oxidation byproducts (OBPs), removal and transformation of bulk organics, and removal of DBP precursors will be discussed with the main findings summarized in Table 2.

3.1 OBPs formation

Carbonyl compounds, carboxylic acids, and keto-acids have been reported to be the main OBPs formed due to the reaction

Table 2 Formation of organic byproducts (OBPs) and transformation of bulk organics in HCO processes

OBPs formation	<ul style="list-style-type: none"> Aldehydes production more depends on O_3 dose Keto-acids production usually is lower in HCO Carboxylic acids production depends on O_3 dose and interactions between DOM and catalysts Similar TOX production in the presence of Cl^- as in ozonation; less TOX production in the presence of Cl^- and Br^-^a
DOM removal & transformation	<ul style="list-style-type: none"> Enhance TOC removal Increase biodegradability of bulk organics UV254 removal depends on catalysts & DOM characteristics
Removal of DBP precursors	<ul style="list-style-type: none"> Decrease THMFP and HAAFP May increase BIF of THMs & HAAs Effects on HANEP depend on matrices & O_3 dose

^a Limited studies available.



between ozone and DOM.^{21,51–53} The addition of solid catalysts may alter the exposure of bulk organics to O₃, increase the production of ·OH, and introduce surface adsorption and complexation, thus changing the OBPs formation.

In the study of catalytic ozonation of BZA and reduction of toxic by-products in a primary/secondary effluent matrix with LaCoO₃, at a lower O₃ dose (e.g. 1 mg L⁻¹) the production of total aldehydes increased with time, but was always lower in catalytic ozonation than in ozonation, whereas at higher O₃ doses (e.g. 2 mg L⁻¹ and 5 mg L⁻¹), total aldehydes increased then decreased and the production was similar with or without catalysts.²⁷ Formation of oxalic acid, on the other hand, was higher in catalytic ozonation with LaCoO₃ than ozonation at the O₃ dose of 1 mg L⁻¹ but lower at the O₃ dose of 2 mg L⁻¹ and 5 mg L⁻¹.²⁷ In catalytic ozonation of filtered river water, the yields of aldehydes and acetone were higher in the process of O₃/α-FeOOH than that of ozonation alone because of the enhanced production of ·OH which can effectively oxidize DOM into low molecular weight (MW) molecules such as aldehydes. In contrast, such yields in the O₃/CeO₂ were close to that of ozonation.⁵⁴ In the same study, the production of keto-acids was lower with O₃/CeO₂ than with O₃/α-FeOOH and both catalytic processes yielded less total keto-acids than ozonation alone when O₃ was in excess.⁵⁴ Moreover, the two catalysts exhibited different influence on the yield of carboxyl acids, which was in the order of O₃/α-FeOOH > O₃ > O₃/CeO₂.⁵⁴ Such different behavior was ascribed to the fact that unlike α-FeOOH promoting ·OH generation, CeO₂ enhanced the O₃ degradation of low MW compounds *via* adsorption and surface complexes.^{54,55}

Similarly, in a comparative study of ozonation and FeOOH catalyzed ozonation of different DOM fractions isolated from filtered river water, lower yields of keto-acids were reported after catalytic ozonation of hydrophobic acid and neutral (HOA and HON) and hydrophilic acid (HIA) fractions, whereas the yields of carboxylic acids from these three fractions were higher in the process of O₃/FeOOH as compared to ozonation alone.⁵⁶ In the meantime, no significant difference was observed for the production of keto-acids and carboxylic acids from the hydrophilic base (HIB) fraction in the O₃ and O₃/FeOOH processes.⁵⁶ As for aldehydes and acetone, addition of FeOOH led to higher yields from HIA and HIB fractions, lower yields from HON fractions, and no effect on HOA fraction.⁵⁶ Further, in a parallel study of fluorescence spectroscopic characterization of DOM fractions after ozonation and catalytic ozonation (FeOOH and CeO₂), it was found catalytic ozonation substantially enhanced the formation of low aromaticity and low MW by-products from HIA fraction and improved the destruction of highly polycyclic aromatic structures for all DOM fractions.⁵⁷

Lastly, halogenated organic byproducts may be formed during oxidation treatment in the presence of Cl⁻ and Br⁻. Interestingly, HCO produced similar amount of total organic halogen (TOX) as ozonation of EfOM matrix (Cl⁻: 121 mg L⁻¹); but with the addition of 0.1 mg L⁻¹ Br⁻, HCO generated much less TOX than sole ozonation.²⁷ It was suspected that ·OH may change the EfOM structure, making it less reactive to Br⁻ and

HOBr/OBr⁻ and can also degrade the formed halogenated organic byproducts.²⁷

Production of OBPs depends on the reactivity of precursors and OBPs with O₃/·OH, interactions between DOM/OBPs and catalysts, characteristics of DOM, and O₃ dose. ·OH generally has higher oxidizing capability and is more effective in degrading DOM into low MW compounds. For the low MW compounds that have similar reactivity with O₃ and ·OH such as aldehydes, yields of these OBPs may more depend on O₃ dose than the addition of catalysts that promotes ·OH generation. For OBPs with higher reactivity towards ·OH such as keto-acids, the production usually is lower in the presence of catalyst especially at a sufficient O₃ dose. Short-chain carboxylic acids such as oxalic acid are considered as the “bottleneck” and main OBPs of AOPs. Very often accumulation of carboxylic acids is observed in HCO, which is sometimes higher than ozonation alone due to more effective degradation of precursors such as keto-acids by ·OH. While these OBPs are described as refractory to both O₃ and ·OH in some studies, it should be noted although much lower than those of many other organic compounds, their reaction rate constants with ·OH are still several orders of magnitude higher than that with O₃ (for example, oxalic acid was frequently used as the model compounds in HCO studies).^{58,59} Hence, eventually it might be the high energy consumption that makes the elimination of OBPs economically inhibitive in HCO, and integration with other treatment processes such as biofiltration may be a more cost-effective approach to further polish the treated water quality.^{28,60,61}

3.2 Removal and transformation of bulk organics

Humic substances represent a major fraction of NOM in virtually all drinking water sources as well as effluent organic matter (EfOM) from biological wastewater treatment. Hence humic acid (HA) has been chosen as a target compound in several HCO studies and a higher mineralization rate was reported for the HCO processes in comparison to ozonation alone under otherwise same conditions, owing to higher ·OH generation.^{62–64} In particular, Tang *et al.* examined the acute toxicity of the treated water by ozonation and catalytic ozonation with Cu/Ce–Al₂O₃ and found that the toxicity of HCO treated water was 56% lower than that of ozonation ascribed to the effective removal of toxic intermediates of HA degradation (e.g. phenolic compounds or long-chain hydrocarbon compounds). It was also suggested that minimizing metallic ion leaching from the catalyst was important for further reduction of the treated water toxicity.⁶⁴

Furthermore, several studies were conducted to investigate the degradation and transformation of DOM from natural water or wastewater in HCO processes. Compared to ozonation alone, HCO generally led to a higher TOC/DOC removal^{20,56,65–67} but the ratio of assimilable organic carbon (AOC) was reported to increase in HCO treated water especially in the hydrophilic acid and base fractions of DOM.^{56,65,68} Dabuth *et al.* investigated molecular changes of DOM after catalytic ozonation with TiO₂ coated activated carbon (TiO₂-AC) employing unknown



screening analysis with Orbitrap mass spectrometry, and reported that catalytic ozonation decreased or removed more CHO features than that of ozonation alone owing to the generation of more reactive species (e.g. $\cdot\text{OH}$ and $\cdot\text{O}_2^-$).⁶⁸ Furthermore, a few hundred CHO features were increased or newly formed after oxidation treatment, indicating the formation of OBPs, whereas the number of OBPs was also lower for $\text{O}_3/\text{TiO}_2\text{-AC}$ processes than ozonation.⁶⁸ Reduction of UV_{254} (mainly denoting organic compounds with double bonds or aromatic structures) seemed to depend on the characteristics of DOM as well as catalysts. An enhanced UV_{254} removal was observed in catalytic ozonation of filtered water NOM with $\text{TiO}_2/\text{Zeolite}$ and CeO_2 ,^{55,65} but a lower removal than ozonation was reported for MgO and goethite.⁵⁵ It was also found that HCO improved the UV_{254} reduction for fractions of $\text{MW} > 1000$ Da but not much for lower-MW components of organic matter from a filtered river water.⁵⁶ A study on catalytic ozonation (copper supported alumina) of different DOM fractions from secondary effluent of a petrochemical wastewater plant reported lower SUV_{254} reduction than ozonation alone for both hydrophilic and hydrophobic substances but a higher DOC removal for all fractions.⁶⁷ Often ozonation was only effective for hydrophobic fractions and may transform them to hydrophilic substances.^{20,66,67} Furthermore, interactions between DOM and catalysts can also affect the oxidation processes. Although the enhanced DOC reduction in both HCO processes was ascribed to $\cdot\text{OH}$ formation, the higher efficiency of the O_3/FeOOH system than the O_3/MgO was explained by higher DOM adsorption on MgO , which may adversely affect O_3 mass transfer and access to the active sites of the catalyst.⁵⁵ However, Sun *et al.* suggested that O_3 and generated $\cdot\text{OH}$ could react with DOM adsorbed on the catalyst surface and allow for further adsorption from the bulk solution, and a dynamic balance between oxidation and re-adsorption was important for DOM removal in HCO processes.⁶⁷ On the other hand, degradation of DOM in CeO_2 catalytic ozonation was attributed to surface complexation, not $\cdot\text{OH}$ formation, resulting in a low efficiency.⁵⁵

3.3 Removal of DBP precursors

Hydrophobic fractions of NOM have been reported to be the major precursors of trihalomethanes (THMs).^{69,70} Since both ozone and HCO can remove hydrophobic substances, THM formation potential (THMFP) can be reduced in these processes as well. For example, TiO_2 -catalyzed ozonation and ozonation alone removed 80% and 45% THM precursors respectively, during the treatment of a groundwater sample dominated by fulvic acid fraction.²⁰ Similar trend was also observed for TiO_2 -catalyzed ozonation of river water and the higher the ozone dose, the greater the THMFP reduction.⁷¹ Catalytic ozonation with LaCoO_3 showed better efficiency than sole ozonation on the reduction of formation potential of two THMs, trichloromethane (TCM) and bromodichloromethane (BDCM), during the treatment of a mixture of primary and secondary effluent.²⁷ Moreover, Fe-Mn oxide, $\text{TiO}_2/\text{Al}_2\text{O}_3$, and synthetic goethite ($\alpha\text{-FeOOH}$) catalyzed ozonation were also found to remove more

THMs and nine haloacetic acids (HAA9) precursors than ozonation alone in the treatment of filtered river water.^{28,61} During the treatment of 11 filtered natural water samples sampled from upstream to downstream along Jingmi Channel (China), $\text{Ru}/\text{AC}-\text{O}_3$ process was reported to reduce HAAFP much more efficiently than ozonation alone, but such enhancement was less pronounced for THMs, probably because the reduction of THMFP was already high in ozonation.⁷² In addition to reduction of DBPFP, HCO can also affect the species distribution of DBPs. While the THMFP and HAAFP decreased, the bromine incorporation factor (BIF) of THMs and HAAs increased with catalyst dosage during chlorination after HCO treatment.²⁸ On the other hand, in a study investigating DBP formation during chlorination of a HCO treated Diclofenac (DCF) solution with co-existing Br^- , Chen *et al.* found that Fe-Cu-MCM-41/ O_3 pretreatment led to less bromate, THMs, and HAAs as well as Br-DBP formation than O_3 pretreatment, owing to the more effective removal of hydrophobic and transphilic intermediates generated from DCF degradation.⁴⁰

Hydrophilic fractions of NOM have been found to be rich in nitrogenous matters as the potential precursors of N-DBPs,⁷³ hence oxidation processes may increase the N-DBP formation due to the oxidation of hydrophobic fractions and consequent increase of hydrophilic fractions. An increased haloacetonitrile formation potential (HANFP) compared with raw water was reported after ozonation and TiO_2 -catalyzed ozonation treatment of groundwater.²⁰ Further, while TiO_2/O_3 produced less HANs than O_3 direct oxidation by O_3 was found to be more effective for specific HANFP reduction compared to the radical pathway.²⁰ In contrast, ozonation and catalytic ozonation with LaCoO_3 decreased the HANFP during the treatment of a primary/secondary effluent mixture, where the reduction by catalytic ozonation was higher than ozonation at lower O_3 doses (1 mg L^{-1} and 2 mg L^{-1}) but lower at a higher O_3 dose (5 mg L^{-1}).²⁷ In addition to the different matrices (groundwater²⁰ vs. primary/secondary effluent²⁷), the O_3 dose may be one important reason for the different observations. Unfortunately, it is difficult to make direct comparisons as one was reported as $3 \text{ mg O}_3/\text{mg DOC}$ ²⁰ and the other $1\text{--}5 \text{ mg L}^{-1} \text{ O}_3$.²⁷ Moreover, O_3 and $\text{LaCoO}_3/\text{O}_3$ can also reduce the precursors of emerging DBPs, haloacetamides (HAcAms), with the $\text{LaCoO}_3/\text{O}_3$ process being more efficient.²⁷

Lastly, it should be pointed out that the observed enhancement of DBPFP removal in HCO may not all be ascribed to the high $\cdot\text{OH}$ in the presence of catalysts because it has been showed that adsorption by the catalysts (e.g. Fe-Mn oxide) can also remove a significant amount of precursors.⁶¹ However, most studies did not look into the adsorption effects of catalysts with only a few exceptions.^{61,72}

4. Summary and perspective

While heterogeneous catalytic ozonation processes have shown a great potential in enhancing the removal of recalcitrant organic pollutants, formation of byproducts as well as transformation of bulk organics and the consequent impacts on DBPs formation calls for more attention. In this regard, the



main findings of the relevant literature can be summarized as follows:

- As the major inorganic byproduct of concern in ozonation processes, bromate can be formed *via* both direct O₃ oxidation and indirect ·OH oxidation pathways. Very often the presence of catalysts accelerates the O₃ decomposition and increases ·OH generation, and thus bromate formation may be inhibited or promoted depending on the dominant reaction pathway (direct *vs.* indirect) in the system. The addition of catalysts can also affect the generation of H₂O₂ which may reduce HOBr/OBr⁻. Decomposition of O₃ can also generate reactive species (*e.g.* HO₂⁻/O₂⁻) that accelerate the redox cycle of the metal species on the catalyst surface, during which Br species (*e.g.* Br[·]/BrO[·], HOBr/OBr⁻, and BrO₃⁻) are reduced resulting in less bromate formation. Lastly, some catalysts (*e.g.* CeO₂) may adsorb O₃/O₂-containing species and inhibit O₃ decomposition into ·OH and subsequent bromate formation.

- For organic byproducts, aldehydes yield may more depend on O₃ dose than the addition of catalysts. Keto-acids production is usually lower in HCO than ozonation alone. Carboxylic acids can accumulate in both ozonation and HCO processes and the yields are influenced by O₃ dose and interactions between NOM/OBPs and catalysts.

- HOC can increase DOC removal and biodegradability of the bulk organics. HCO may also decrease THMFP and HAAFP, but may increase bromine incorporation factor of THMs and HAAs. Its effect on HANFP depends on the matrices and O₃ dose.

Despite some progress has been made in understanding byproducts formation during HCO, there are still some important issues that need to be further investigated and addressed:

- It is encouraging that most of the studies reported an inhibition of bromate formation in HCO. However, elucidation of the underlying mechanism can be challenging due to the high heterogeneity of the system and the complex interactions between different species as well as the solid catalysts. Also because of the multiple reaction pathways possibly involved, it is relatively easy to formulate a hypothesis to explain the experimental observations but difficult to confirm and validate it. Therefore, a rigorous and comprehensive experimental design is required to probe the mechanism (which is likely to be system-specific due to the diversity of catalysts) and facilitate further process enhancement and optimization. Moreover, most of the studies reported in the literature were carried out in synthetic solutions not environmental matrices. Although starting with a “clean” matrix is a reasonable approach for initial evaluation and mechanism investigation, further examination of the matrix effects is needed, especially as it has been shown that co-existence of organic and inorganic precursors can affect the final byproducts formation.

- Due to the ubiquity and diversity of NOM in the environmental waters, investigation on the organic byproducts' formation and transformation of bulk organics in HCO can be more challenging. In order to enhance our understanding and gain insights from different studies collectively, it is important for the research community to standardize the experimental protocols and provide enough information so to enable

comparisons and systematic evaluation. For example, regardless of the addition of catalysts, O₃ dose is one most influencing factor that determines process performance and byproducts formation. Due to the limitation of mass transfer in most laboratory setup, it is recommended O₃ dose to be reported as total transferred dose during the treatment not just the concentrations in the feeding gas or aqueous phase.

- Some catalysts that promote surface complexation with DOM instead of ·OH production (*e.g.* CeO₂) seem to perform better in OBPs control. However, the efficiency for the removal of recalcitrant pollutants as well as possible catalyst fouling in long-term performance in real environmental waters may need further evaluation. In the meantime, direct interactions with catalysts (*e.g.* adsorption) can play an important role and should be evaluated in all HCO studies to truly understand the underlying mechanism.

Conflicts of interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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