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### Review

### Extracellular polymeric substances-antibiotics interaction in activated sludge: A review

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#### ABSTRACT

Antibiotics, the most frequently prescribed drugs, have been widely applied to prevent or cure human and veterinary diseases and have undoubtedly led to massive releases into sewer networks and wastewater treatment systems, a hotspot where the occurrence and transformation of antibiotic resistance take place. Extracellular polymeric substances (EPS), biopolymers secreted via microbial activity, play an important role in cell adhesion, nutrient retention, and toxicity resistance. However, the potential roles of sludge EPS related to the resistance and removal of antibiotics are still unclear. This work summarizes the composition and physicochemical characteristics of state-of-the-art microbial EPS, highlights the critical role of EPS in antibiotics removal, evaluates their defense performances under different antibiotics exposures, and analyzes the typical factors that could affect the sorption and biotransformation behavior of antibiotics. Next, interactions between microbial EPS and antibiotic resistance genes are analyzed. Future perspectives, especially the engineering application of microbial EPS for antibiotics toxicity detection and defense, are also emphatically stressed.

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#### 1. Introduction

Antibiotics are the most frequently used pharmaceuticals for preventing and treating infectious diseases in humans and animals, with global consumption of 42 billion defined daily doses in recent years [1]. Since the antibiotics used are only partially metabolized in the human and animal digestive tracts, large amounts of antibiotics are discharged into the aquatic ecosystem from point sources (pharmaceutical industries, hospitals, and households) and nonpoint sources (agricultural and urban runoffs) [2], leading to severe pollution throughout the world. Recent works revealed that the average concentrations of typical antibiotics in different environmental matrices (such as wastewater, sewage, river sediment, and soil) ranged from  $\mu g L^{-1}$  to  $ng L^{-1}$  [3,4].

Municipal wastewater treatment plants (WWTPs) are considered the core facilities for antibiotics reception and dissemination [5]. However, WWTPs are not specifically constructed for antibiotics treatment and removal [2]. Therefore, the removal of

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antibiotics varies over orders of magnitude during WWTPs operation, depending on the physicochemical properties of antibiotics, sludge activities, and the operational parameters of WWTPs [2]. The existence of antibiotics and their residues not only inhibits microbial activity and subsequently affects the microbial community composition but also promotes the growth of antibioticresistant bacteria and the subsequent dissemination of antibiotic resistance genes (ARGs) [6].

Extracellular polymeric substances (EPS), the typical highmolecular-weight microbial polymers composed of hydrocarbons, proteins, humic organics, etc., are responsible for the adsorption of biotoxins, mediating toxic inhibition, and protecting organisms against external threats [7]. In addition to being an extracellular physical barrier, EPS could also provide many functional groups (e.g., carboxyl, hydroxyl, amino, phosphoryl, and sulfhydryl groups) for contaminant adhesion and further decrease their exposure risk and toxic stress [8]. Undoubtedly, EPS play a dominant role in antibiotics adsorption, preventing their direct contact with microbes to endow microbes with resistance to antibiotics [1].

Recently, several studies have confirmed and emphasized the role of EPS in antibiotic stress resistance during WWTPs operation [2,9,10]; however, systematic and in-depth analyses of EPS

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feedback under different antibiotics exposures, especially the complex interactions and potential mechanisms between the antibiotics and EPS are still lacking, which limits the potential application of sludge EPS for antibiotics removal. Therefore, the interactions between EPS and antibiotics were systematically elucidated and analyzed. This study summarized the basic knowledge of EPS and its importance in resisting antibiotics stress. Subsequently, the performance and potential mechanisms of EPS concerning antibiotics removal were evaluated. Several critical operating factors affecting EPS-antibiotics interactions were also analyzed in detail. Furthermore, recent advances in EPS and antibiotics resistance genes (ARGs) were also analyzed. Finally, future opportunities for functional and engineering applications of EPS were outlined. Overall, this review aims to provide insights into the complex interactions between EPS and antibiotics to achieve an optimized protection approach to effectively alleviate antibiotics inhibition in WWTPs.

# 2. Effects of EPS composition and functions on antibiotics exposure

#### 2.1. EPS composition and functions

Microbial EPS are complex biopolymer mixtures of proteins, polysaccharides, nucleic acids, etc., which can be divided into tightly bound EPS (TB-EPS), loosely bound EPS (LB-EPS), and soluble EPS (S-EPS) according to their binding degree with cells [11–13]. Generally, EPS present a network-like structure with different functional groups (such as carboxyl-, phenolic-, sulfhydryl-, phosphoric-, and hydroxyl-related groups) and polar groups (aromatic-, aliphatic-, hydrophobic-regions, etc.), which play a vital role in sludge aggregation, floc formation, and pollutant biotransformation [14,15]. In addition, EPS is closely related to multiple sludge properties, including hydrophilicity/hydrophobicity ratio, biosorption, bioflocculability, settleability, surface-charge distribution, and biodegradability [16]. In addition, certain growth conditions, such as nutrient limitation and the presence of toxins (e.g., heavy metals and antibiotics), may lead to the secretion of EPS and activate its barrier effect to resist the unfavorable environment and reduce oxidative stress.

Recently, tremendous works have clarified the role of EPS in environmental remediation and stress resistance, especially for emerging contaminants such as antibiotics and ARGs [17-19]. Sludge EPS, especially proteins and polysaccharides with abundant functional groups, such as carboxyl, amine, and hydroxyl groups, can effectively bind with antibiotics and form a stable EPSantibiotics complex, thereby achieving the efficient removal of antibiotics (>60%) [20]. Notably, EPS structures and binding performances with antibiotics are greatly affected by the associated EPS molecules and environmental conditions (e.g., pH, temperature, substrates, and presence of toxins) [7]. For example, changes in environmental conditions such as pH and temperature might affect the stability of the EPS-antibiotics complex [21,22]. The types of substrates and the presence of toxins (e.g., heavy metals and antibiotics) might change the compositions, contents, and secondary structure of EPS, subsequently affecting the adsorption capacity and rate. In addition to adsorption, antibiotics can be degraded or transformed due to the presence of abundant exoenzymes, including hydrolases for carbohydrates, amylases for starch, and proteases for proteinaceous substrates [23,24]. The porous structure and complex matrix of EPS are helpful to capture antibiotics and retain exoenzymes, which makes EPS important sites to digest these components before they become accessible to microbial cells [7]. Additionally, multiple redox-active components (e.g., cytochromes, flavins, and phenazine) exist in the EPS matrix,

which could facilitate antibiotic transformation by acting as electron transfer media [25,26]. Considering the multiple complex effects of EPS on antibiotics defense and removal, the detailed feedback performances, potential functional features, and relations to group behaviors should be further clarified.

#### 2.2. Importance of EPS resistance to antibiotics exposure

EPS account for as much as 50–90% of sludge flocs. They have an important role in antibiotics removal in traditional WWTP operation [27], in which the adsorption of antibiotics onto sludge EPS, as well as the potential transformation, played an important role in antibiotics removal, compared to the hydrolysis and volatilization mechanism [2]. For example, several studies have confirmed that microbial EPS are an important potential reservoir that could hinder sulfamethizole and sulfonamide antibiotics diffusion, hence alleviating direct cell-antibiotic interactions and the subsequent inhibition effects [8,10].

Diffusion of antibiotics (e.g., fluoroquinolones and  $\beta$ -lactams related) led to a large quality generation of reactive oxygen species, negatively affecting the biomass functions via the deterioration of respiratory rate, inhibition of enzymatic activities, and damaging of cells and intracellular DNA [28,29]. The protection provided by EPS reduces the negative effects of antibiotics on catalase and super-oxide dismutase, thereby mediating the stress of reactive oxygen species in cells [8,30]. In contrast, after the extraction of the EPS, an obvious decline in enzymatic activity was observed, accompanied by the mortality of the microbes, release of intracellular substances, and declining respiration rates under sulfamethizole exposure [8,31]. Moreover, lower community richness and diversity were observed under sulfamethizole exposure without EPS protection [8].

## 3. Performance and potential mechanisms of EPS resistance to antibiotics stress

#### 3.1. Adsorption of antibiotics onto EPS

Once toxic antibiotics enter the WWTP systems and contact sludge, abundant functional groups in the dense network structure of EPS bind with antibiotics immediately and serve as a permeability barrier against antibiotics erosion. Three stages of rapid adsorption, stable adsorption, and saturation adsorption could be observed during antibiotics sorption onto sludge EPS [18,32]). Among the kinetic models, in comparison with the pseudo-firstorder reaction kinetics equation, the pseudo-second-order kinetics equation exhibited a better fit for antibiotics (e.g., trimethoprim, sulfonamide, tetracycline) adsorption simulation, implying that the adsorption was driven by chemical action [17,18,33,34]. Additionally, the sorption isotherm analysis revealed that the Freundlich equation might be much more suitable for illuminating the sorption characteristics between EPS and antibiotics (e.g., quinolone, sulfonamide, tetracycline, ciprofloxacin) than the Langmuir model, indicating that multilayer adsorption or even more complex sorption might occur on the microbial EPS surface [32,35-37].

The main mechanisms related to antibiotics adsorption onto EPS mainly include (1) electrostatic interactions (e.g., cation bridging,  $\pi$ - $\pi$  conjugation reaction, anion exchange), (2) hydrogen bonding, (3) hydrophobic interactions, and (4) surface complexation [36,38,39], and are listed in Fig. 1a. During the adsorption process, functional groups (i.e., carboxyl, hydroxyl, and amine) of proteins in EPS were bound with antibiotics, and formed a stable and compact EPS-antibiotics complex, thereby reducing the toxicity of antibiotics (Fig. 1b) [40]. The interaction order of EPS components to tetracycline exhibited a declining trend of tyrosine residues  $\rightarrow$ 



Fig. 1. a, Sorption mechanisms of different antibiotics onto sludge EPS. b FTIR spectra of EPS extracted from sulfate-reducing bacteria sludge (A), anaerobic sludge (B), and aerobic sludge (C) modified from Ref. [44], copyright (2018) ACS publications. c, The order priority of sludge EPS components interacted with tetracycline, modified from Ref. [1]; copyright (2021) Elsevier.

tryptophan  $\rightarrow$  humic acid, and the larger molecular weight components in EPS exhibited a priority interaction trend with tetracycline antibiotics than the smaller molecular weight ones (Fig. 1c) [40]. [39] reported that even though sulfamethazine could be both adsorbed by EPS-related humic-like and protein organics, the binding strength of antibiotics onto protein was almost >2.0 orders of magnitude higher than that of humic-like EPS; because the percentage of proteins in EPS was approximately 3–4 times higher in comparison with the humic-like organics, the proteins undoubtedly played a predominate role in antibiotics removal, which was closely related to their higher binding ability and larger percentage distribution. Similarly, Xu et al. [39] observed that the static quenching of fluorophores in EPS proteins with 25 mg L<sup>-1</sup> sulfamethazine adsorption and the Gibbs free energy of the sulfamethazine binding onto sludge EPS was thermodynamically favorable, which revealed a spontaneous binding process and stable EPSantibiotics complex formation [9]. reported that the zeta potential of the EPS-sulfamethoxazole complex increased with increasing concentrations. Generally, the higher the zeta potential value is, the stronger the electrostatic repulsion [41]; thus, the adsorption of antibiotics decreased the negative charges of sludge and changed the configuration of EPS [42]. reported that the biomolecule size of the EPS declined as tetracycline concentrations increased from 0 to 100 mg L<sup>-1</sup>, indicating that the continuous toxic stress of antibiotics caused the EPS structure to fold. In addition, the secondary structure of the protein in the EPS (e.g.,  $\alpha$ -helix/( $\beta$ sheet + random coil) and  $\beta$ -sheet value) increased with the steady increase in antibiotic concentrations [43]. Overall, these important physical structures and chemical characteristic variations would be helpful to improve the adsorption capacity of EPS and facilitate adsorption processes, including hydrophobicity-dependent and hydrophobicity-independent adsorption, which played a key role in antibiotics adsorption onto sludge EPS and the subsequent toxic resistance [2]. Therefore, the chemical compositions and structures of the microbial cells changed insignificantly because EPS protected cells and alleviated antibiotics stress.

After binding with antibiotics, the expansion of polymers and the stretching of the peptide chains (conformation of protein) caused a more irregularly loose and porous EPS morphology, which is meaningful to mass transfer and antibiotics capture [39]. However, the variation in the sludge EPS is not irreversible, and antibiotics might be released under the effects of photolysis, oxidation, and heating [42]. The highly mobile characteristics of the EPSantibiotic complex exist in dissolved form, and diffusion and dissemination risks of antibiotics resistance in aquatic environments may exist [42]. Therefore, the EPS-antibiotics complex still poses a potential ecological risk.

#### 3.2. EPS synthesis regulated by quorum sensing

In addition to the adsorbing effect, the AHL-mediated quorum sensing (QS) system was activated by antibiotics pressure at the same time since a large number of EPS was synthesized and secreted after gene expression, forming a network structure outside the cells (hindering the direct contact between antibiotics and microbes) to alleviate toxic stress (Fig. 2). QS mechanism regulation has been regarded as the main reason for the regulation of EPS production, adjusting bacterial abundance and maintaining functional bacterial activity, especially under antibiotics stress [10]. After the QS system was activated, second messenger molecules such as N-acylhomoserine lactones (AHLs) were synthesized, which led to the main expression of intracellular genes of sludge [45], especially the genes related to overexpressed pressure induction, transcriptional regulation and EPS synthesis (such as *lapA* and *lapF*) [46–48].

Briefly, short-chain AHLs, including C4-HSL, C6-HSL, and C8-HSL, were secreted and enhanced EPS production under antibiotics stress, which improved the antibiotics tolerance of the biomass [50]. In addition, the production of long-chain AHLs (e.g., C10-HSL, C12-HSL, and C14-HSL) benefited antibiotics stress release

in sludge reactors [50]. Under the effect of AHLs, the content of EPS, especially the protein and polysaccharides, increased rapidly. Considering that the antibiotics diffusion coefficient in polysaccharides and glycoproteins was only 40–72% of that of water [51], the diffusion of antibiotics was effectively retarded, and the direct interaction between antibiotics and intercellular cells was alleviated by the newly generated EPS [31]. In addition, an increase in tryptophan, tyrosine, and humic substances of sludge EPS, as well as functional groups and binding sites, were observed for antibiotics defense [52].

Although most of the EPS functional groups were stable under antibiotics resistance, the compositions of the EPS observed via the FTIR spectra [53] changed slightly, indicating that the microbes secreted different types of components to resist or reduce the damage of biotoxins to bacteria. For the predominant fractions of sludge EPS, the content and percentage of protein and polysaccharide varied obviously for both TB-EPS and LB-EPS once antibiotics resistance occurred. For example [54], observed that the abundant existence of sulfamethoxazole (10 mg  $L^{-1}$ ) led to the protein/polysaccharide ratio of LB-EPS increasing from 2.6 to 3.5, indicating that the stress-induced microorganisms to secrete more protein (protein was more responsible for stress release than the polysaccharide). Therefore, EPS-related proteins play an essential role in antibiotics binding via complex interactions, including hydrophobic effects, cation bridging, and polymer entanglement, to form a dense network structure to guard against adverse stress [53]. The increased protein/polysaccharide ratio also indicated that the hydrophobicity of sludge samples increased [9.44].

In addition to the changes in EPS compositions, the types of EPS also varied greatly under antibiotics stress. For example [55], reported that the content of TB-EPS sharply increased from 34 mg L<sup>-1</sup> to 46 mg L<sup>-1</sup> under the stress of 5 mg L<sup>-1</sup> oxytetracycline antibiotics via QS feedbacks. Subsequently, the conversion of TB-EPS to LB-EPS was also observed as a protective response to oxytetracycline antibiotics bound or adsorbed onto LB-EPS promptly reacted with TB-EPS, leading to the destruction of the chemical composition of TB-EPS and an obvious simultaneous increase in LB-EPS [55]. Overall, TB-EPS served as the first protective barrier for microorganisms to defend against oxytetracycline antibiotics exposure



Fig. 2. EPS synthesis and regulation under different antibiotics exposure via QS, reprinted with permission from Ref. [49]; copyright (2022) Elsevier.

owing to their dense and tight structure, which may play a vital role in resisting antibiotics toxicity [56].

However, the resistance ability of EPS is still limited, and overloaded antibiotics gradually consume the active sites and finally deteriorate the EPS function [57]. For example [58], stated that a high concentration (20 mg  $L^{-1}$ ) of sulfamethoxazole led to the observations of polysaccharide destruction, amino acid denaturation, and protein secondary structure destruction, as well as the conservation of tryptophan-like proteins into aromatic rings and, finally, obvious changes in the EPS composition. In addition, the fluorescence intensity of aromatic proteins and humic acid-like organics declined sharply to almost quenching [58]. This may lead to the penetration of the antibiotic into sludge cells, while the latter may develop ARGs to mitigate lethal effects under long-term exposure to antibiotics. Although the increased sulfadiazine may induce microbes to generate more EPS to release stress, the inevitable occurrence of ARG blooms would be observed under longterm stress [59]. Additionally, the molecular structure of the protein in the EPS was destroyed under 40 mg  $L^{-1}$  ciprofloxacin stress; subsequently, the humic acid-like substance became the predominant component of sludge EPS [60].

#### 3.3. Transformation of antibiotics promoted by EPS

The adsorbed antibiotics would be dynamically complexed by EPS [10], and many types of extracellular active degradative enzymes exist in EPS, such as  $\alpha$ -amylase,  $\beta$ -amylase, and protease

[7,23], which would hydrolyze those higher biomolecules into lower molecular weight organics and thus enhance the removal of antibiotics [24,61]. In addition, antibiotics can also be degraded into nontoxic substances via biological transformation [61–63]. [64] reported that a series of enzyme-catalyzed reactions, including amide hydrolysis, substituent oxidation, and sulfide oxidation, occur during the transformation of five antibiotics, including amoxicillin, ampicillin, clindamycin, daptomycin, and linezolid. They also reported a noteworthy biotransformation potential of antibiotics among the soluble extracellular enzymes extracted from activated sludge via the measurement of protease and peptidase activity [64].

In addition to enzyme-related transformation, the photochemical behavior of EPS was also beneficial for antibiotics transformation (Fig. 3). Briefly, the portions of EPS with higher C/H and O/C ratios, leading to the phototransformation of EPS generate reactive species (triplet intermediates, •OH, and  $^{1}O_{2}$ ), are more susceptible to antibiotics photolysis [65]. [66] reported that the transformation of tetracycline under illumination was enhanced from 6.6% to 95.7% by reactive species (triplet intermediates ( $^{3}EPS*$ ), hydroxyl radicals (•OH), and singlet oxygen ( $^{1}O_{2}$ )) via a series of photochemical reactions, including demethylation, deamination, and oxidization. It should be noted that the hybrid effects of the chemical characteristics of sludge EPS and the intensity of illumination on antibiotics reduction are important and practical, especially in natural aquatic environments involving massive amounts of EPS, such as estuaries and wetlands [66]. The



Fig. 3. a, Transformation process of antibiotics on EPS. b, Proposed biotransformation pathway for antibiotics enzyme degradation (blue box) and photo-transformation (yellow box), reprinted with permission from Ref. [67], copyright (2019) Elsevier.



Fig. 4. Mechanisms of antibiotic resistance genes adsorption on EPS.

photochemical sensitivity characteristics of sludge EPS would strengthen the natural attenuation capability of natural waters and provide novel methods for antibiotic removal.

#### 3.4. Mitigating ARGs proliferation by EPS

Refractory antibiotics cannot be completely biodegraded in traditional WWTPs. Microbes develop genetic mutations to mitigate lethal effects under long-term antibiotic exposure, even at the  $\mu$ g L<sup>-1</sup> level [68,69]. Abundances of ARGs generally exhibited an increasing trend with the increasing of antibiotic concentrations [44,70], whereas the generated antibiotic resistance might be transmitted and spread to other bacteria [71]. A bacterial host cell can acquire antibiotic resistance through the following three different routes: vertical gene transfer, de novo mutation, and horizontal gene transfer (HGT) [71]. During wastewater treatment, HGT (including transduction, conjugation, and transformation) is considered a major avenue for ARGs proliferation because ARGs can potentially be acquired by new bacteria and obtain resistance via natural transformation in downstream environments [58,72]. ARGs can exist in both extracellular and intracellular forms, and either conjugation or transduction might be the major route of transmission for intracellular ARGs in the cell [73], whereas extracellular ARGs can be captured by several nonresistant bacteria, or mobile genetic elements (MGEs), such as integrons or abiotic pellets through transformation, leading to the dissemination and proliferation of extracellular ARGs [74]. Generally, extracellular ARGs in cell-free form have received more attention due to their easy diffusion and proliferation via HGT [44].

EPS with a strong adsorption capacity might selectively capture some extracellular ARGs, retard extracellular ARGs proliferation and interaction, and weaken ARGs HGT [19,75,76]. Compared with cell-free ARGs, the abundance of EPS-associated ARGs (e.g., sull, sullI, bla<sub>TEM-1</sub>, tetA, tetO, tetQ, tetW) were more abundant than cellfree ARGs (0.2-4.6 orders of magnitude higher) [19,77], and corresponding mechanisms of antibiotic resistance genes adsorption on EPS are as follows: (1) the vast net-like structure of the EPS played a key role in ARGs separation and retention [78], via the ion bridging effect, hydrophobic effect and polymer entanglement [76,79]; (2) the abundant existence of colloids and flocs in wastewater enhanced the retention of ARGs [76], and facilitated ARGs removal [80]; and (3) the potential changes in the stretch degree for peptide chains and amino groups of protein in sludge EPS [39,76] led to an increase in surface area, which improved the ARGs adsorption capacity of sludge EPS [81,82] (Fig. 4).

associated ARGs were higher than those of corresponding intracellular ARGs (e.g., sull, blaTEM-1, and tetA) and cell-free ARGs (e.g., sull and sullI) [77], the transformation risks of extracellular ARGs were 3.6–4.6 logs higher than those of cell-free ARGs [19,77], which could lead to the risk of EPS-associated ARGs HGT. Additionally, the environmental risk exhibited by adsorbed extracellular ARGs was much higher than that of the free extracellular ARGs because of their special enzymatic hydrolysis protection effect, undoubtedly allowing them to persist in the aquatic environment for a long period [83].

#### 4. Factors influencing EPS-antibiotics interactions

The chemical structure and composition of the microbial EPS during wastewater biological treatment processes greatly affect the antibiotics biosorption and removal process. It is closely related to the variation in the operational parameters, such as temperature, anion or cation types, solution pH, antibiotic concentrations and types, and the types of biological treatment processes [84]. The potential affecting factors are summarized and discussed here to clarify the interaction characteristics of antibiotics and EPS (see Table 1).

#### 4.1. EPS chemical characteristics

The chemical characteristics of sludge EPS strongly correlate with the sludge type and environmental conditions and strongly affect antibiotics adsorption [2]. Here, the typical chemical compositions and characteristics of different sludge EPS are summarized and listed in Table 2. Specifically, a noteworthy observation of higher EPS production and a higher portion of  $\alpha$ -helice was found for aerobic sludge EPS than for the anaerobic sludge systems [44,82,85]. Compared with the floc sludge, higher contents of proteins with larger molecular weights (such as aromatic and tryptophan proteins) detected in the granular sludge than those in flocs sludge might be the reason that the granular sludge exhibits superior resistance to antibiotics [1,86]. Additionally, higher contents were preferentially observed in granular sludge than floc sludge, which might be the main reason for its excellent resistance to the toxic stress of antibiotics [58,87]. Correspondingly, the EPS of sulfate-reducing bacterial sludge possessed more functional groups and higher affinity and binding strength for antibiotics adsorption than those of activated sludge and anaerobic sludge [44].

Substrates, as the main energy source of microorganisms, greatly affect EPS synthesis and chemical compositions [44,99]. For example, the percentage of protein in heterotrophic sludge was much higher than that of polysaccharides, whereas autotrophic sludge exhibited a converse trend [100]. Reportedly, the abundant existence of carbohydrate-related substrates would be beneficial for the synthesis of polysaccharides in sludge EPS [101.102], while protein content increased with the presence of peptone and serinerelated substances (protein-like) [49]. Additionally, sludge fed with starch has a higher polysaccharide content in EPS than sludge fed with glucose [103]. Similarly, the protein content in EPS increased with increasing polymerization degree [20]. [100] observed that sludge fed with easily biodegradable substrates would generate more protein in EPS, restraining humic acid production. Undoubtedly, the obvious variation in the sludge EPS composition would affect the distribution of the functional groups and adsorption regions (hydrocarbons, proteins, polysaccharides, and nucleic acids) and finally lead to different antibiotics removal efficiencies [49].

#### 4.2. Types of antibiotics

Considering that the relative abundances of some EPS-

As shown in Table 3, the widely used antibiotics could be

#### Table 1

EPS response under different antibiotics exposure.

Antibiotics types	Concentration	EPS source	EPS response	References
Tetracycline	$100 \ \mu g \ L^{-1}$	Activated sludge	EPS concentration (in mg per g VSS) increased from 66 to 181	[57]
Ciprofloxacin	$300 \ \mu g \ L^{-1}$	Biofilm	TB-EPS concentration (in mg per g VSS) increased from 133 to 180	[88]
Tetracycline	500 $\mu g L^{-1}$	Aerobic granular sludge	EPS concentration (in mg per g VSS) increased from 63.8 to 94.1	[89]
Ciprofloxacin	$500 \ \mu g \ L^{-1}$	Aerobic Sludge	Tryptophan-like proteins in EPS (in mg per g VSS) increased 64.04 to 74.33	[44]
Sulfamethoxazole + Erythromycin	$500 + 50 \; \mu g \; L^{-1}$	Anammox sludge	EPS content increased to 187 mg per g VSS	[9]
Sulfamethoxazole	$1 \text{ mg L}^{-1}$	Anammox sludge	EPS content increased and its structure became compact	[43]
Tetracycline	2 mg L <sup>-1</sup>	Aerobic sludge	The relative hydrophobicity and flocculability of EPS improved	[90]
Sulfamethoxazole	$2.5 \text{ mg L}^{-1}$	Anammox sludge	The structure of extracellular proteins became compact	[1]
Sulfamethazine	$2.5 \text{ mg L}^{-1}$	Activated sludge	The spatial structure of EPS changed to fold	[39]
Nor flox a cin + Trime tho prim + Sulfame tho xazole + Tetracycline the second secon	$2 + 1 + 1 + 1 + 1 + 1 \text{ mg } L^{-1}$	Aerobic sludge	Bound-EPS content increased from 68 $\pm$ 12 to 120 $\pm$ 10 mg g <sup>-1</sup> MLSS	[91]
Erythromycin	$10 \text{ mg L}^{-1}$	Anammox sludge	The dense structure of EPS became loose	[92]
Erythromycin	$10 \text{ mg } \text{L}^{-1}$	Activated sludge	Protein in EPS (in mg per g VSS) increased 18 to 48	[93]
Ery thromy cin + Sulfame thox azole + Tetracycline	$1 + 10 + 1 \text{ mg } \text{L}^{-1}$	Anammox sludge	The protein/polysaccharide ratio and the hydrophobicity of EPS increased, the aggregation of sludge improved	[94]
Tetracycline	$5 \times 10^{-5} \text{ mol } \text{L}^{-1}$	Aerobic granular sludge	The fluorescence of humic acid-like organics and proteins were nearly quenched, gel strength of EPS was decreased	[58]
Erythromycin ethylsuccinate	0.01 mol L <sup>-1</sup>	Activated sludge	The fluorescence of the aromatic protein fraction and the soluble microbial by-products-like substances was quenched	[95]
Sulfamethoxazole	20 mg L <sup>-1</sup>	Anammox Sludge	The random coils of EPS increased, and protein structure became loose ( $\alpha$ -helices decreased)	[1]
Ciprofloxacin	$40~mg~L^{-1}$	Biofilm	Protein-like substances decomposed, percentage of humic acid-like substance increased	[60]
Tetracycline	50 mg L <sup>-1</sup>	Anammox granular sludge	EPS binding sites were occupied completely, viscoelasticity decreased, the sturcture stability was disrupted	[52]
Erythromycin	$50 \text{ mg } \mathrm{L}^{-1}$	Anammox sludge	EPS decomposed and reduced, while the concentration of SMP was suddenly increased	[92]

#### Table 2

Chemical characteristics and compositions of different sludge EPS cultured with different substrates.

EPS source	Carbon source	Extraction method	EPS content (mg per g VSS)	Protein (mg per g VSS)	Polysaccharide (mg per g VSS)	Humic acid (mg per g VSS)	Protein/ Polysaccharide	Zeta potential (mV)	α- helix (%)	References
Aerobic ammonium- oxidizing bacteria	Inorganic wastewater	Heat extraction	49.41	17.77	31.74	_	0.56	-	21.93	[82]
Anaerobic ammonium- oxidizing bacteria	Inorganic wastewater	Heat extraction	-	53.12	30.12	_	2.64	_	23.13	[82]
Activated sludge	Municipal wastewater	Heat extraction	31.84	21.09	10.76	-	1.96	-	16.70	[82]
Activated sludge	Municipal wastewater	Cation exchange resin method	22.95	11.10	5.70	6.14	1.95	-14.70	-	[96]
Nitrifying activated sludge	Without any organic carbon	Cation exchange resin method	86.69	20.30	47.20	19.19	0.43	-16.97	-	[96]
Anammox sludge	Synthetic nitrogen wastewater	Cation exchange resin method	57.13	33.00	8.95	19.97	3.69	-13.70	-	[96]
Anammox granules	Municipal wastewater	Acid-alkaline extraction method	210	134.4	14.7	-	9.14	_	30.5	[97]
Anammox granules	Synthetic wastewater	Heat method	74.0	62.16	11.84	-	5.25	-	37.7	[98]
Anammox sludge	Synthetic wastewater	Heat method	324.3	204.3	28.8	-	7.09	12.3	16.79	[43]

Table 3Interactions between EPS and antibiotics.

Target antibiotics	Antibiotics structure	EPS source	Adsorption Isotherms	Biosorption model	Action sites	Driving force	log Kow	Acid dissociation constants (pK <sub>a</sub> )	References
$ \begin{array}{l} Sulfamethazine (SMZ) \\ C_{12}H_{14}N_4O_2S \\ M.W = 278.3 \ g \ mol^{-1} \end{array} $	H <sub>N</sub> N CH <sub>3</sub>	Activated sludge	_	_	Tryptophan-like protein, humic-like organics	Hydrophobic interaction	0.19	2.65, 7.65	[39]
$\label{eq:suffamethoxazole} \begin{split} & \text{Sulfamethoxazole} \ (\text{SMX} \\ & \text{C}_{10}\text{H}_{11}\text{N}_3\text{O}_3\text{S} \\ & \text{M.W} = 253.3 \ \text{g} \ \text{mol}^{-1} \end{split}$		Klebsiella sp. J1	_	Pseudo- second-order model	Tyrosine, Tryptophan	Hydrophobic interaction	0.89	1.85, 5.70	[18]
$ \begin{array}{l} Sulfamethizole \\ C_9H_{10}N_4O_2S_2 \\ M.W = 270.3 \ g \ mol^- \end{array} $		Biofilm	Freundlich model	_	Protein-like and humic- like organics	_	-	_	[8]
$\label{eq:sulfadiazine} \begin{split} &Sulfadiazine~(SDZ)\\ &C_{10}H_{10}N_4O_2S\\ &M.W=250.3~g~mol^{-1} \end{split}$	H <sub>2</sub> N N N	Activated sludge	_	_	tyrosine-like substances	_	-0.09	2.10, 6.18	[107]
Ciprofloxacin (CIP) $C_{17}H_{18}FN_3O_3$ M.W = 331.3 g mol <sup>-1</sup>	F OH	Excess sludge	Freundlich model	_	Protein-like substances	_	0.28	6.0, 8.8	[36]
$\label{eq:sarafloxacin} \begin{array}{l} (SAR) \\ C_{20}H_{17}F_2N_3O \\ M.W = 385.4 \ g \ mol^{-1} \end{array}$		Excess sludge	Freundlich model	_	-	-	1.07	5.6, 8.2	[36]
$\label{eq:moxifloxacin} \begin{array}{l} Moxifloxacin (MOX) \\ C_{21}H_{24}FN_3O_4 \\ M.W = 401.4 \ g \ mol^{-1} \end{array}$		Excess sludge	Freundlich model	_	-	-	0.95	6.4, 9.5	[36]
$\begin{array}{l} \mbox{Tetracycline (TET)}\\ \mbox{C}_{22}\mbox{H}_{24}\mbox{N}_2\mbox{O}_8\\ \mbox{M.W}=444.4\mbox{ g mol}^{-1} \end{array}$		Anammox granular sludge	_	_	Tryptophan, tryptophan type-proteins and humic acids	Hydrophobic force	-1.30	3.3, 7.7, 9.7	[52]
$\begin{array}{l} \mbox{Tetracycline (TET)}\\ \mbox{C}_{22}\mbox{H}_{24}\mbox{N}_2\mbox{O}_8\\ \mbox{M.W}=444.4\mbox{ g mol}^{-1} \end{array}$		Pseudomonas sp. TC952.	Langmuir model	First-order kinetic model	Tyrosine and tryptophan	Hydrophobic interaction	-1.30	3.3, 7.7, 9.7	[49]
Oxytetracycline $\begin{array}{l} C_{22}H_{24}N_2O_9 \\ M.W = 460.4 \ g \ mol^{-1} \end{array}$	HO CH, DH CH, OH HO CH, OH CH, OH HO CH	Sludge	Langmuir model	Pseudo- second-order model	-	_	-1.12	3.2, 7.5, 8.9	[108]
$\label{eq:chortestracycline} \begin{split} Chlortetracycline \\ C_{22}H_{23}ClN_2O_8 \\ M.W = 478.9 \ g \ mol^- \end{split}$		Sludge	Langmuir model	Pseudo- second-order model	-	_	-0.62	3.3, 7.6, 9.3	[108]
$\label{eq:constraint} \begin{array}{l} \mbox{Trimethoprim (TMP)} \\ \mbox{$C_{14}H_{18}N_4O_3$} \\ \mbox{$M.W=290.3$ g mol}^{-1$} \end{array}$		Activated sludge	_	Pseudo- second-order kinetic model.	Tyrosine and tryptophan	_	0.91	3.23, 6.76	[96]
Ciprofloxacin (CIP) $C_{17}H_{18}FN_3O_3$ M.W = 331.3 g mol <sup>-1</sup>	F OH	Secondary- treated sludge	Langmuir model	Pseudo-first- order kinetic equation	-	_	0.28	6.16, 8.63	[109]

classified into β-lactams, quinolones, tetracyclines, macrolides, sulfonamides, etc., according to their physicochemical structure and molecular properties. The overall biosorption performance of antibiotics by EPS was primarily related to their physical-chemical properties, including their molecular structure, solubility, acid dissociation constants (pKa), partition coefficient, speciation, hydrophobicity, and octanol-water coefficient (log Kow). For example, the complexity of molecular structures could affect their adsorption by EPS. For example, increasing the bulky isobutoxy group at position N1 would lead to a decline in the sorption ability of ofloxacin, whereas the opposite trend was observed for cyclopropyl and ethyl groups in norfloxacin and ciprofloxacin [104]. The torsion of the ring, as well as the changes in the planar structure of the molecule caused by the bulky group, promoted the steric hindrance of possible H-bonds and benefited the subsequent sorption [104]. In addition, antibiotics are amphoteric molecules relative to their pKa values, which can be cationic, neutral, or anionic with the variation of the aqueous pH [2]. Additionally, the hydrophobicity of antibiotics is tightly related to their adsorption ability. For example, antibiotics with log Dow <1 or log Kow <2.5 tend to exhibit a low adsorption potential, while antibiotics with log Dow >3 or log Kow >4 have high adsorption potential [22,105]. For example, the adsorption of clarithromycin (log Kow = 3.16) onto sludge was better than that of sulfamethoxazole (log Kow = 0.89) owing to its strong adsorption characteristics [106].

In addition to the chemical molecular structure, the biodegradability of the antibiotics is affected by the stereochemical groups, which are closely related to the stability and complexity of the antibiotics. Usually, low molecular-weight antibiotics with unsaturated aliphatic groups would be more preferentially degraded than long-chain antibiotics with branched structures and aromatic groups [110]. For example, fluoroquinolone antibiotics are more recalcitrant and resistant than the other antibiotics due to the special fluorine atom in their structure [111,112], which finally leads to the long half-life time of antibiotic transformation in activated sludge [111,113,114]. In addition, the real wastewater environment always contains multiple antibiotics, and the corresponding competitive adsorption might mutually affect their adsorption and biotransformation behaviors.

#### 4.3. Wastewater chemical properties

Wastewater chemical properties (e.g., operational pH and ionic strength) also affected antibiotics adsorption onto the microbial cell surfaces. For example, the adsorption process and mechanism of antibiotics on activated sludge were highly pH dependent, and their reduction efficiency was restricted to a specific pH condition [115]. The main reason might be that aquatic pH affected the patterns of antibiotics and EPS. Specifically, ionic antibiotics may exist as cations, zwitterions, or anions formed under different solution pH values [116]. Usually, the maximum adsorption capacity of antibiotics of solution coefficient ( $K_d$  values) or adsorption capacity of antibiotics reaching its maximum value under neutral conditions.

Generally, those antibiotics predominantly presented as the cationic phase under acidic conditions because of the binding of -NH or -N onto  $H^+$ , as well as the abundant existence of electropositive microbial cell floc in biosolids [117]. Therefore, the  $K_d$  value (or adsorption capacity) declined obviously owing to the electrostatic repulsion between antibiotics and EPS [117]. For comparison, the loss of  $H^+$  from the -COOH groups of the antibiotics, accompanied by increasing pH, might be the main reason for the cationic bridging between the metals and -COOH groups within the

antibiotics in the sludge EPS [117]. In addition, the antibiotics could combine with sludge via cationic exchange and electrostatic attraction. Specifically, the cation fractions of the antibiotics continuously declined under basic conditions once they adsorbed onto the sludge EPS, similar to the  $K_d$  values, indicating a strong electrostatic interaction between the negatively charged sludge flocs and those cationic antibiotics [36,117]. In addition to the antibiotics type, the secondary structure of the EPS also changed widely with variations in pH [36]. The main reasons could be summarized as follows: (1) the transformation of proteins from helical to unordered random conformation; (2) the smaller and looser EPS structure leading to higher binding sites of the sludge EPS, better adsorption of antibiotics, and further release of extracellular proteins [118].

The existence of multiple metal species within the real water environment may also mutually affect the adsorption of the antibiotics. For low concentrations of heavy metals, the bridging and complexation of metal cations promoted the antibiotics sorption onto the microbial surfaces [36,119,120]. In contrast, a high concentration of metal ions competed with antibiotics for binding sites, which shielded adsorption sites and finally decreased adsorption efficiency [121,122]. For example [116], observed that the abundant existence of  $Ca^{2+}$  (121 mg  $L^{-1}$ ) and  $Mg^{2+}$ (269 mg  $L^{-1}$ ) (divalent cations) in saline sludge efficiently decreased the sorption performance of norfloxacin antibiotics onto the EPS surface from 91.6% to 60.5%. Moreover, ion valence would also affect the sorption performance of antibiotics onto the EPS surface. Previous research also reported that bivalent cations have a stronger competitive adsorption capacity than monovalent cations. which might be related to the electronegativity of bivalent ions  $(Ca^{2+} and Mg^{2+})$  is higher than that of monovalent cations  $(Na^{+} and$  $K^+$ ) [123,124]. The stronger the ability of metal ions to attract electrons, the more significant complexation between EPS and metals [124].

In addition to heavy metals and inorganic ions, coexisting substances (such as various dissolved organics and surfactants) in wastewater may damage the hydrophobic interaction between the EPS-antibiotics complex, and subsequently cause antibiotics to be desorbed from EPS [39], finally causing the release of antibiotics into the environment.

#### 4.4. Operating conditions

Considering that the origins and chemical components of EPS are quite complex, the production and defense process of EPS may be influenced by many operational parameters, such as temperature and solid retention time.

Temperature is a vital factor influencing EPS production and antibiotics adsorption. Usually, the productivity of EPS increases gradually with increasing temperature and reaches its maximum production under the optimum growth temperature, which mainly depends upon the bacterial strain. Recent work revealed that the optimal temperature for EPS generation was approximately 25–30 °C [14]. Correspondingly, the removal of antibiotics also improved due to the increase in EPS content and the promotion of microbial activities, while an excessive temperature restricted the growth of microbes, which led to the transformation of EPS and a low antibiotics removal rate [21,22]. Interestingly, a decrease in polysaccharide content mas observed with decreasing temperature, while the protein content increased as the temperature dropped [125].

Mild temperatures benefited the EPS-antibiotics binding processes due to the decline in the migration speed of antibiotics at low temperatures. Thermodynamic adsorption analysis revealed that the maximum unit adsorption capacity of antibiotics decreased and the adsorption equilibrium constant increased with increasing temperature, indicating a stronger interaction between EPS and antibiotics at higher temperatures [18,126,127]. This phenomenon might be closely related to the increasing disorder of the reaction. Additionally, the above results also indicated that the antibiotics sorption was exothermic under natural conditions (the adsorption capacity declined with increasing temperature) [128]. The isothermal titration microthermal result demonstrated that the EPS-antibiotics complex was quite stable, as evidenced by the negative Gibbs free energy observation after the antibiotics bind to the sludge EPS [16]. When hydrophobic interactions are damaged under high temperatures, the antibiotics may desorb from EPS, which causes a risk of antibiotics release into the environment.

In addition to the temperature, the solid retention time is another key operational parameter for ESP production, affecting EPS-antibiotics interactions. The sorption ability of EPS decreased sharply after reducing the solid retention time due to the decreased biomass concentration in the reactors [129]. Conversely, a higher biomass concentration was observed with increasing solid retention time, which enhanced the opportunity for the interaction between antibiotics and the sludge EPS [129]. However, a higher solid retention time enriched those slow-growing rate microorganisms, increased the diversity of microbial communities, and promoted the secretion of degradative enzymes in EPS, therefore improving the antibiotic removal efficiency [105].

#### 5. Future perspectives

### 5.1. Developing an early warning system for biotoxin inhibition based on EPS variations

The operational efficiency of WWTPs is susceptible to interference by influent antibiotics. Long-term exposure to antibiotics stress would cause a series of changes in the metabolic pathway of microbial cells and even possibly lead to death, which would prolong the start-up time and increase the process risk [53,70,130]. As a result, monitoring and analyzing the microbial response performance to antibiotic variations is crucial for the stable operation and optimization of biological wastewater treatment systems [131]. However, traditional antibiotics inhibition detection methods, such as enzyme activity detection and biological acute toxicity tests [131,132], are time-consuming and expensive.

Additionally, EPS exists on the surface of microbial cells or fills the internal voids of their aggregates. Antibiotics entering the wastewater biological treatment system adhere to the sludge floc and cause different variations in some physical parameters (e.g., zeta potential and contact angle) and chemical composition (e.g.,  $\alpha$ helix/( $\beta$ -sheet + random coil) and  $\beta$ -sheet value) of EPS [43,133]. For example, the zeta potential of EPS was obviously increased with exposure to antibiotics (e.g., sulfamethoxazole and erythromycin) [9], whereas it gradually declined after binding with heavy metals (e.g., As(III), Cd (II), Pb (II), and Cr (VI)) [43,134]. In addition to zeta potential, the secondary protein structure of EPS showed a different trend under the stress of As(III) and sulfamethoxazole (SMX). The  $\alpha$ -helix/( $\beta$ -sheet + random coil) of protein in EPS increased under SMX stress, whereas the value decreased under As(III) stress [43]. The  $\beta$ -sheet value decreased with increasing As(III) dosage but increased with the increasing sulfadiazine, ciprofloxacin, and sulfadiazine-ciprofloxacin [43,135].

Therefore, based on the characteristic response of EPS physicochemical parameters to antibiotics' toxic effects, it is vital and feasible to develop an innovative in-situ and real-time method for analyzing EPS "fingerprint signals", which can identify the degree of biotoxin inhibition in wastewater biological treatment systems. The linkage response mechanisms of the physicochemical signals of sludge EPS and the microbial community distribution of the abovementioned wastewater treatment systems should be evaluated to identify the key signaling molecules. Combined with cluster analysis and dimensionality reduction optimization, a biotoxicity identification method based on EPS signaling molecules should be constructed.

#### 5.2. Strengthen the antibiotics biotransformation abilities of EPS

When a large amount of antibiotic-containing wastewater enters a WWTP in a short time, in addition to early warning detection, it is more important to reduce its toxicity and inhibition to activated sludge. Therefore, the antibiotics biotransformation ability of activated sludge in WWTPs is essential to relieve the toxicity inhibition of antibiotics [64]. Previous studies reported the presence of bioactive enzymes in sludge EPS, such as laccases which can promote the biotransformation of antibiotics and improve the removal efficiencies for persistent antibiotics [64,136]. However, the production of bioactive enzymes is controlled at the cellular level by various genes and is low due to the limited expression level of synthase in vivo.

Synthetic biology has been successfully used to build engineered microbial strains or consortia with excellent toxin resistance ability and efficient pollutant degradation capacities [7,137–139]. For example [137], reported that the *Rhodococcus* sp. strain p52 harboring two mega plasmids, i.e., pDF01 and pDF02, decreased the dibenzofuran content (120 mg  $L^{-1}$ ) in the synthetic wastewater by 32.6–100% compared to that in the reactor without the genetic bioaugmentation strain. It is also suitable for modifying and producing EPS [7]. Therefore, exploring microbes modified by functional enzyme genes such as laccase enzyme, and improving the efficient transformation capacity of EPS on antibiotic, may be an effective choice to reduce the inhibition effects of antibiotics. In addition, considering the unforeseeable effects of genetic engineering technology, it is necessary to pay more attention to the long-term effects and risk assessment of engineered microbes in actual wastewater treatment applications.

#### 5.3. Reducing the ARGs release risks from sludge EPS

Generally, traditional biological wastewater treatment, such as activated sludge treatment, often fails to completely remove wastewater antibiotics because of its limited adsorption and biotransformation ability [64]. Residual antibiotics and their metabolites exert continuous selective pressure, which promotes the development of ARGs [140]. Previous studies reported that ARGs could be adsorbed onto sludge EPS and form a stable EPS-ARGs complex [76], and the absolute abundance of EPS-associated ARGs reached  $1.49 \times 10^7$ – $4.45 \times 10^9$  copies per g VSS in sludge [77]. However, the ARGs adsorbed on sludge EPS would be partially released due to the variation of the environmental conditions [49]. Considering that most EPS-associated ARGs are contained in sewage sludge after dewatered treatment, the destruction of the EPS-ARGs complex may cause a secondary release of ARGs into the environment from sewage sludge.

Currently, the estimated sewage sludge productivity in China is approximately 39.2 million tons (with 80% water content) every year [141]; as many as 10<sup>19</sup>–10<sup>22</sup> copies of extracellular ARGs could be enriched in sludge EPS [77]. Usually, most EPS-associated ARGs are concentrated in excess sludge after dewatering treatment and entered into the environment via fertilizer and land applications. Those remaining antibiotics are partially entered into crops and subsequently transferred to the food chain, and the HGT of ARGs were inevitably [77]. Therefore, additional treatment processes are urgently needed to further remove these antibiotics and their ARGs before sludge agricultural utilization, especially the transformation of EPS-associated ARGs, which would be helpful to control antibiotic resistance dissemination risk.

#### 6. Conclusions

This review summarizes the performances, mechanisms, and influencing factors of EPS resistance to antibiotics stress in the wastewater treatment process. Regarding the adsorption of antibiotics, chemical adsorption, especially hydrophobic effects, hydrogen bonding, ionic interactions, and cation bonding, are the main mechanisms that occur during the adsorption of antibiotics onto EPS. Moreover, new EPS were synthesized under the regulation of the AHL-mediated quorum sensing system to resist the stress of antibiotics. Those adsorbed antibiotics were subsequently transformed into nontoxic substances under the joint effect of extracellular active degradative enzymes and EPS phototransformation. Furthermore, EPS can retain extracellular ARGs, prevent ARGs leakage risks and weaken ARGs transformation. EPSantibiotics interactions are affected by several factors, including the sludge type, substrate source, antibiotics types and concentrations, solution properties, and temperature. Although some progress has been achieved in understanding the effect of EPS on antibiotics and ARGs transformation during WWTP operation, information on the mechanisms and actual engineering of EPS and antibiotics/ARGs is still very limited and warrants further investigation.

#### Author contributions

Weixin Zhao: Conceptualization, Writing-Original Draft, Writing-review & editing. Jia You: Investigation, Visualization, Writing-original draft. Shilei Yin: Investigation, Writing-original draft, Writing-review & editing. Haizhou Yang: Visualization, Writing-review & editing. Shufei He: Investigation, Writing-review & editing. Likui Feng: Conceptualization, Writing-review & editing. Jianju Li: Conceptualization, Supervision. Qingliang Zhao: Conceptualization, Writing-Original Draft, Writing-review & editing. Liangliang Wei: Conceptualization, Writing-Original Draft, Writingreview & editing, Project administration, Funding acquisition.

#### **Declaration of competing 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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#### References

- [1] G. Li, W. Ma, Z. Ren, Y. Wang, J. Li, J. Zhao, S. Li, Q. Liu, Y. Gu, Y. Cheng, B. Huang, R. Jin, Molecular insight into the binding property and mechanism of sulfamethoxazole to extracellular proteins of anammox sludge, Environ. Sci. Technol. 55 (24) (2021a) 16627–16635.
- [2] A.S. Oberoi, Y. Jia, H. Zhang, S.K. Khanal, H. Lu, Insights into the fate and removal of antibiotics in engineered biological treatment systems: a critical review, Environ. Sci. Technol. 53 (13) (2019) 7234–7264.
- [3] F. Ju, K. Beck, X. Yin, A. Maccagnan, C.S. McArdell, H.P. Singer, D.R. Johnson, T. Zhang, H. Bürgmann, Wastewater treatment plant resistomes are shaped by bacterial composition, genetic exchange, and upregulated expression in the effluent microbiomes, ISME J. 13 (2) (2019) 346–360.

- [4] J.L. Wilkinson, A.B.A. Boxall, D.W. Kolpin, K.M.Y. Leung, R.W.S. Lai, C. Galbán-Malagón, A.D. Adell, J. Mondon, M. Metian, R.A. Marchant, A. Bouzas-Monroy, A. Cuni-Sanchez, A. Coors, P. Carriquiriborde, M. Rojo, C. Gordon, M. Cara, M. Moermond, T. Luarte, V. Petrosyan, Y. Perikhanyan, C.S. Mahon, C.J. McGurk, T. Hofmann, T. Kormoker, V. Iniguez, J. Guzman-Otazo, J.L. Tavares, F. Gildasio De Figueiredo, M.T.P. Razzolini, V. Dougnon, G. Gbaguidi, O. Traoré, J.M. Blais, L.E. Kimpe, M. Wong, D. Wong, R. Ntchantcho, J. Pizarro, G. Ying, C. Chen, M. Páez, J. Martínez-Lara, I. Otamonga, I. Poté, S.A. Ifo, P. Wilson, S. Echeverría-Sáenz, N. Udikovic-Kolic, M. Milakovic, D. Fatta-Kassinos, L. Ioannou-Ttofa, V. Belušová, J. Vymazal, M. Cárdenas-Bustamante, B.A. Kassa, J. Garric, A. Chaumot, P. Gibba, I. Kunchulia, S. Seidensticker, G. Lyberatos, H.P. Halldórsson, M. Melling, T. Shashidhar, M. Lamba, A. Nastiti, A. Supriatin, N. Pourang, A. Abedini, O. Abdullah, S.S. Gharbia, F. Pilla, B. Chefetz, T. Topaz, K.M. Yao, B. Aubakirova, A.Z. Aris, L.J. Looi, M. Niang, S.T. Traore, R. Oldenkamp, O. Ogunbanwo, M. Ashfaq, M. Iqbal, Z. Abdeen, A. O Dea, J.M. Morales-Saldaña, M. Custodio, H. de la Cruz, I. Navarrete, F. Carvalho, A.B. Gogra, et al., Pharmaceutical pollution of the world's rivers, Proc. Natl. Acad. Sci. USA 119 (8) (2022), e2113947119.
- [5] C. Ferreira, J. Abreu-Silva, C.M. Manaia, The balance between treatment efficiency and receptor quality determines wastewater impacts on the dissemination of antibiotic resistance, J. Hazard Mater. 434 (2022), 128933.
- [6] K. Qin, Q. Zhao, H. Yu, X. Xia, J. Li, S. He, L. Wei, T. An, A review of bismuthbased photocatalysts for antibiotic degradation: insight into the photocatalytic degradation performance, pathways and relevant mechanisms, Environ. Res. 199 (2021), 111360.
- [7] H.Q. Yu, Molecular insights into extracellular polymeric substances in activated sludge, Environ. Sci. Technol. 54 (13) (2020) 7742–7750.
- [8] L. Wang, Y. Li, L. Wang, H. Zhang, M. Zhu, P. Zhang, X. Zhu, Extracellular polymeric substances affect the responses of multi-species biofilms in the presence of sulfamethizole, Environ. Pollut. 235 (2018b) 283–292.
- [9] N. Fan, J. Fu, D. Huang, Y. Ma, Z. Lu, R. Jin, P. Zheng, Resistance genes and extracellular proteins relieve antibiotic stress on the anammox process, Water Res. 202 (2021), 117453.
- [10] J. Xu, G. Sheng, Microbial extracellular polymeric substances (EPS) acted as a potential reservoir in responding to high concentrations of sulfonamides shocks during biological wastewater treatment, Bioresour. Technol. 313 (2020), 123654.
- [11] C. Kunacheva, D.C. Stuckey, Analytical methods for soluble microbial products (SMP) and extracellular polymers (ECP) in wastewater treatment systems: a review, Water Res. 61 (2014) 1–18.
- [12] T. Seviour, N. Derlon, M.S. Dueholm, H. Flemming, E. Girbal-Neuhauser, H. Horn, S. Kjelleberg, M.C.M. van Loosdrecht, T. Lotti, M.F. Malpei, R. Nerenberg, T.R. Neu, E. Paul, H. Yu, Y. Lin, Extracellular polymeric substances of biofilms: suffering from an identity crisis, Water Res. 151 (2019) 1–7.
- [13] T. Seviour, Z. Yuan, M.C.M. van Loosdrecht, Y. Lin, Aerobic sludge granulation: a tale of two polysaccharides? Water Res. 46 (15) (2012) 4803–4813.
- [14] T.T. More, J.S.S. Yadav, S. Yan, R.D. Tyagi, R.Y. Surampalli, Extracellular polymeric substances of bacteria and their potential environmental applications, J. Environ. Manag. 144 (2014) 1–25.
- [15] M. Zhang, L. Yuan, Z. Li, H. Zhang, G. Sheng, Tetracycline exposure shifted microbial communities and enriched antibiotic resistance genes in the aerobic granular sludge, Environ. Int. 130 (2019b), 104902.
- [16] X. Tian, Z. Shen, Z. Han, Y. Zhou, The effect of extracellular polymeric substances on exogenous highly toxic compounds in biological wastewater treatment: an overview, Bioresource Technology Reports 5 (2019) 28–42.
- [17] Y. Ma, P. Yuan, Y. Wu, H. Meng, G. Wang, W. Xie, L. Zhang, J. Ma, Y. Xiao, Insight into the role of different extracellular polymeric substances components on trimethoprim adsorption by activated sludge, J. Environ. Manag. 306 (2022), 114502.
- [18] S. Pi, A. Li, D. Cui, Z. Su, L. Feng, F. Ma, J. Yang, Biosorption behavior and mechanism of sulfonamide antibiotics in aqueous solution on extracellular polymeric substances extracted from Klebsiella sp, J1. Bioresource Technol. 272 (2019) 346–350.
- [19] L. Wang, L. Yuan, Z. Li, X. Zhang, K.M.Y. Leung, G. Sheng, Extracellular polymeric substances (EPS) associated extracellular antibiotic resistance genes in activated sludge along the AAO process: distribution and microbial secretors, Sci. Total Environ. (2021a), 151575.
- [20] B. Wang, X. Liu, J. Chen, D. Peng, F. He, Composition and functional group characterization of extracellular polymeric substances (EPS) in activated sludge: the impacts of polymerization degree of proteinaceous substrates, Water Res. 129 (2018a) 133–142.
- [21] C. Feng, T. Lotti, R. Canziani, Y. Lin, C. Tagliabue, F. Malpei, Extracellular biopolymers recovered as raw biomaterials from waste granular sludge and potential applications: a critical review, Sci. Total Environ. 753 (2021), 142051.
- [22] N.H. Tran, M. Reinhard, K.Y. Gin, Occurrence and fate of emerging contaminants in municipal wastewater treatment plants from different geographical regions-a review, Water Res. 133 (2018) 182–207.
- [23] B. Fr Olund, T. Griebe, P.H. Nielsen, Enzymatic activity in the activated-sludge floc matrix, Appl. Microbiol. Biotechnol. 43 (4) (1995) 755–761.
- [24] D. Zhang, J. Gao, L. Zhang, W. Zhang, J. Jia, H. Dai, Z. Wang, Responses of nitrification performance, triclosan resistome and diversity of microbes to

- [25] L. Shi, H. Dong, G. Reguera, H. Beyenal, A. Lu, J. Liu, H. Yu, J.K. Fredrickson, Extracellular electron transfer mechanisms between microorganisms and minerals, Nat. Rev. Microbiol. 14 (10) (2016) 651–662.
- [26] Y. Xiao, E. Zhang, J. Zhang, Y. Dai, Z. Yang, H.E.M. Christensen, J. Ulstrup, F. Zhao, Extracellular polymeric substances are transient media for microbial extracellular electron transfer, Sci. Adv. 3 (7) (2017), e1700623 e1700623.
- [27] L. Wei, J. Li, M. Xue, S. Wang, Q. Li, K. Qin, J. Jiang, J. Ding, Q. Zhao, Adsorption behaviors of Cu<sup>2+</sup>, Zn<sup>2+</sup> and Cd<sup>2+</sup> onto proteins, humic acid, and polysaccharides extracted from sludge EPS: sorption properties and mechanisms, Bioresour. Technol. 291 (2019), 121868.
- [28] D.J. Dwyer, M.A. Kohanski, J.J. Collins, Role of reactive oxygen species in antibiotic action and resistance, Curr. Opin. Microbiol. 12 (5) (2009) 482–489.
- [29] F. Vatansever, W.C.M.A. de Melo, P. Avci, D. Vecchio, M. Sadasivam, A. Gupta, R. Chandran, M. Karimi, N.A. Parizotto, R. Yin, G.P. Tegos, M.R. Hamblin, Antimicrobial strategies centered around reactive oxygen species - bactericidal antibiotics, photodynamic therapy, and beyond, FEMS Microbiol. Rev. 37 (6) (2013) 955–989.
- [30] B. Jiang, Q. Zeng, Y. Hou, H. Li, S. Shi, Z. Chen, Y. Cui, D. Hu, H. Ge, S. Che, Y. Sui, Y. Qi, The responses of activated sludge to membrane cleaning reagent H<sub>2</sub>O<sub>2</sub> and protection of extracellular polymeric substances, Environ. Res. 203 (2022), 111817.
- [31] X. Han, Z. Wang, M. Chen, X. Zhang, C.Y. Tang, Z. Wu, Acute responses of microorganisms from membrane bioreactors in the presence of NaOCI: protective mechanisms of extracellular polymeric substances, Environ. Sci. Technol. 51 (6) (2017) 3233–3241.
- [32] S. Yang, C. Lin, A. Yu-Chen Lin, P. Andy Hong, Sorption and biodegradation of sulfonamide antibiotics by activated sludge: experimental assessment using batch data obtained under aerobic conditions, Water Res. 45 (11) (2011) 3389–3397.
- [33] S. Pi, A. Li, W. Wei, L. Feng, G. Zhang, T. Chen, X. Zhou, H. Sun, F. Ma, Synthesis of a novel magnetic nano-scale biosorbent using extracellular polymeric substances from Klebsiella sp. J1 for tetracycline adsorption, Bioresour. Technol. 245 (2017) 471–476.
- [34] Y. Ma, P. Yuan, Y. Wu, X. Cheng, H. Meng, H. He, G. Wang, X. Chen, W. Xie, L. Zhang, The inhibitory effect of in situ extracellular polymeric substances on trimethoprim adsorption by activated sludge, Chemosphere 274 (2021c), 129798.
- [35] F. Polesel, K. Lehnberg, W. Dott, S. Trapp, K.V. Thomas, B.G. Plósz, Factors influencing sorption of ciprofloxacin onto activated sludge: experimental assessment and modelling implications, Chemosphere 119 (2015) 105–111.
- [36] D. Cao, W. Yang, Z. Wang, X. Hao, Role of extracellular polymeric substance in adsorption of quinolone antibiotics by microbial cells in excess sludge, Chem. Eng. J. 370 (2019) 684–694.
- [37] D. Cheng, H.H. Ngo, W. Guo, S.W. Chang, D.D. Nguyen, Y. Liu, X. Shan, L.D. Nghiem, L.N. Nguyen, Removal process of antibiotics during anaerobic treatment of swine wastewater, Bioresour. Technol. 300 (2020), 122707.
- [38] F. Jia, Q. Yang, X. Liu, X. Li, B. Li, L. Zhang, Y. Peng, Stratification of extracellular polymeric substances (EPS) for aggregated anammox microorganisms, Environ. Sci. Technol. 51 (6) (2017) 3260–3268.
- [39] J. Xu, G. Sheng, Y. Ma, L. Wang, H. Yu, Roles of extracellular polymeric substances (EPS) in the migration and removal of sulfamethazine in activated sludge system, Water Res. 47 (14) (2013) 5298–5306.
- [40] Z. Li, C. Wan, X. Liu, L. Wang, D. Lee, Understanding of the mechanism of extracellular polymeric substances of aerobic granular sludge against tetracycline from the perspective of fluorescence properties, Sci. Total Environ. 756 (2021d), 144054.
- [41] Z. Li, P. Lu, D. Zhang, G. Chen, S. Zeng, Q. He, Population balance modeling of activated sludge flocculation: investigating the influence of Extracellular Polymeric Substances (EPS) content and zeta potential on flocculation dynamics, Separ. Purif. Technol. 162 (2016) 91–100.
- [42] Q. Xu, B. Han, H. Wang, Q. Wang, W. Zhang, D. Wang, Effect of extracellular polymer substances on the tetracycline removal during coagulation process, Bioresour. Technol. 309 (2020), 123316.
- [43] W. Ma, Z. Ren, L. Yu, X. Wu, Y. Yao, J. Zhang, J. Guo, N. Fan, R. Jin, Deciphering the response of anammox process to heavy metal and antibiotic stress: arsenic enhances the permeability of extracellular polymeric substance and aggravates the inhibition of sulfamethoxazole, Chem. Eng. J. 426 (2021a), 130815.
- [44] H. Zhang, Y. Jia, S.K. Khanal, H. Lu, H. Fang, Q. Zhao, Understanding the role of extracellular polymeric substances on ciprofloxacin adsorption in aerobic sludge, anaerobic sludge, and sulfate-reducing bacteria sludge systems, Environ. Sci. Technol. 52 (11) (2018a) 6476–6486.
- [45] H. Liu, S. Li, X. Xie, Q. Shi, Pseudomonas putida actively forms biofilms to protect the population under antibiotic stress, Environ. Pollut. 270 (2021a), 116261.
- [46] T. Bowen, X. Yingang, L. Junhong, T. Hongbin, W. Fengming, Pressure response of carbapenems Klebsiella pneumoniae under antibiotic stress, Infect. Genet. Evol. 92 (2021), 104915.
- [47] S. Li, C. Zhang, F. Li, T. Hua, Q. Zhou, S. Ho, Technologies towards antibiotic resistance genes (ARGs) removal from aquatic environment: a critical review, J. Hazard Mater. 411 (2021b), 125148.
- [48] V. Rilstone, L. Vignale, J. Craddock, A. Cushing, Y. Filion, P. Champagne, The

role of antibiotics and heavy metals on the development, promotion, and dissemination of antimicrobial resistance in drinking water biofilms, Chemosphere 282 (2021), 131048.

- [49] Z. Tan, M.H. Abdoulahi, X. Yang, Y. Zhu, B. Gong, Y. Li, Carbon source type can affect tetracycline removal by Pseudomonas sp. TC952 through regulation of extracellular polymeric substances composition and production, Sci. Total Environ. 804 (2022), 149907.
- [50] H. Peng, J. Guo, H. Li, Y. Song, C. Lu, Y. Han, Y. Hou, Granulation and response of anaerobic granular sludge to allicin stress while treating allicin-containing wastewater, Biochem. Eng. J. 169 (2021), 107971.
- [51] L. Wang, Y. Li, L. Wang, M. Zhu, X. Zhu, C. Qian, W. Li, Responses of biofilm microorganisms from moving bed biofilm reactor to antibiotics exposure: protective role of extracellular polymeric substances, Bioresour. Technol. 254 (2018c) 268–277.
- [52] S. Liu, C. Lin, X. Diao, L. Meng, H. Lu, Interactions between tetracycline and extracellular polymeric substances in anammox granular sludge, Bioresour. Technol. 293 (2019), 122069.
- [53] B. Du, Q. Yang, X. Li, W. Yuan, Y. Chen, R. Wang, Impacts of long-term exposure to tetracycline and sulfamethoxazole on the sludge granules in an anoxic-aerobic wastewater treatment system, Sci. Total Environ. 684 (2019) 67–77.
- [54] Z. Liu, X. Sun, Z. Sun, Degradation mechanism of montmorillonite-enhanced antibiotic wastewater: performance, antibiotic resistance genes, microbial communities, and functional metabolism, Bioresour. Technol. 352 (2022), 127098.
- [55] Q. He, Z. Xie, Z. Fu, M. Wang, P. Xu, J. Yu, J. Ma, S. Gao, L. Chen, W. Zhang, J. Song, H. Wang, Interaction and removal of oxytetracycline with aerobic granular sludge, Bioresour. Technol. 320 (2021), 124358.
- [56] D. Zheng, Q. Chang, Z. Li, M. Gao, Z. She, X. Wang, L. Guo, Y. Zhao, C. Jin, F. Gao, Performance and microbial community of a sequencing batch biofilm reactor treating synthetic mariculture wastewater under long-term exposure to norfloxacin, Bioresour. Technol. 222 (2016) 139–147.
- [57] M. Huang, W. Zhang, Y. Zheng, W. Zhang, Correlation among extracellular polymeric substances, tetracycline resistant bacteria and tetracycline resistance genes under trace tetracycline, Chemosphere 117 (2014) 658–662.
- [58] Y. Li, J. Wang, B. Li, M. Geng, Y. Wang, J. Zhao, B. Jin, Y. Li, Response of extracellular polymeric substances and microbial community structures on resistance genes expression in wastewater treatment containing copper oxide nanoparticles and humic acid, Bioresour. Technol. 340 (2021c), 125741.
- [59] L. Qiu, J. Wu, W. Du, M. Nafees, Y. Yin, R. Ji, S.A. Banwart, H. Guo, Response of soil bacterial communities to sulfadiazine present in manure: protection and adaptation mechanisms of extracellular polymeric substances, J. Hazard Mater. 408 (2021), 124887.
- [60] L. Zhang, Q. Yue, K. Yang, P. Zhao, B. Gao, Analysis of extracellular polymeric substances (EPS) and ciprofloxacin-degrading microbial community in the combined Fe-C micro-electrolysis-UBAF process for the elimination of highlevel ciprofloxacin, Chemosphere 193 (2018b) 645–654.
- [61] H. Schug, C.W. Isaacson, L. Sigg, A.A. Ammann, K. Schirmer, Effect of TiO<sub>2</sub> nanoparticles and UV radiation on extracellular enzyme activity of intact heterotrophic biofilms, Environ. Sci. Technol. 48 (19) (2014) 11620–11628.
- [62] H. Flemming, J. Wingender, The biofilm matrix, Nat. Rev. Microbiol. 8 (9) (2010) 623–633.
- [63] J. Wingender, T.R. Neu, H.C. Flemming, Microbial Extracellular Polymeric Substances, Microbial Extracellular Polymeric Substances, 1999.
- [64] M.T. Zumstein, D.E. Helbling, Biotransformation of antibiotics: exploring the activity of extracellular and intracellular enzymes derived from wastewater microbial communities, Water Res. 155 (2019) 115–123.
- [65] H. He, F. Han, S. Sun, H. Deng, B. Huang, X. Pan, D.D. Dionysiou, Photosensitive cellular polymeric substances accelerate 17α-ethinylestradiol photodegradation, Chem. Eng. J. 381 (2020), 122737.
- [66] S. Zhou, Z. Liao, B. Zhang, R. Hou, Y. Wang, S. Zhou, Y. Zhang, Z.J. Ren, Y. Yuan, Photochemical behavior of microbial extracellular polymeric substances in the aquatic environment, Environ. Sci. Technol. 55 (22) (2021) 15090–15099.
- [67] Linke Ge, Zhang Peng, Halsall Crispin, Li Yanying, Chen Chang-Er, Li Jun, Sun Helin, Yao Ziwei, The importance of reactive oxygen species on the aqueous phototransformation of sulfonamide antibiotics: kinetics, pathways, and comparisons with direct photolysis, Water Res. 149 (2019) 243–250. https://doi.org/10.1016/j.watres.2018.11.009.
- [68] T.M. Uddin, A.J. Chakraborty, A. Khusro, B.R.M. Zidan, S. Mitra, T.B. Emran, K. Dhama, M.K.H. Ripon, M. Gajdács, M.U.K. Sahibzada, M.J. Hossain, N. Koirala, Antibiotic resistance in microbes: history, mechanisms, therapeutic strategies and future prospects, Journal of Infection and Public Health 14 (12) (2021) 1750–1766.
- [69] K. Qin, L. Wei, J. Li, B. Lai, F. Zhu, H. Yu, Q. Zhao, K. Wang, A review of ARGs in WWTPs: sources, stressors and elimination, Chin. Chem. Lett. 31 (10) (2020) 2603–2613.
- [70] H. Zhang, S. Song, Y. Jia, D. Wu, H. Lu, Stress-responses of activated sludge and anaerobic sulfate-reducing bacteria sludge under long-term ciprofloxacin exposure, Water Res. 164 (2019a), 114964.
- [71] A.Q. Nguyen, H.P. Vu, L.N. Nguyen, Q. Wang, S.P. Djordjevic, E. Donner, H. Yin, L.D. Nghiem, Monitoring antibiotic resistance genes in wastewater treatment: current strategies and future challenges, Sci. Total Environ. 783 (2021), 146964.

- [72] Y. Wang, Y. Han, L. Li, J. Liu, X. Yan, Distribution, sources, and potential risks of antibiotic resistance genes in wastewater treatment plant: a review, Environ. Pollut. 310 (2022), 119870.
- [73] D.M. Dominiak, J.L. Nielsen, P.H. Nielsen, Extracellular DNA is abundant and important for microcolony strength in mixed microbial biofilms, Environ. Microbiol. 13 (3) (2011) 710–721.
- [74] S. Liu, H. Qu, D. Yang, H. Hu, W. Liu, Z. Qiu, A. Hou, J. Guo, J. Li, Z. Shen, M. Jin, Chlorine disinfection increases both intracellular and extracellular antibiotic resistance genes in a full-scale wastewater treatment plant, Water Res. 136 (2018) 131–136.
- [75] P. He, Y. Zhou, L. Shao, J. Huang, Z. Yang, F. Lü, The discrepant mobility of antibiotic resistant genes: evidence from their spatial distribution in sewage sludge flocs, Sci. Total Environ. 697 (2019), 134176.
- [76] Y. Zhu, Y. Wang, S. Zhou, X. Jiang, X. Ma, C. Liu, Robust performance of a membrane bioreactor for removing antibiotic resistance genes exposed to antibiotics: role of membrane foulants, Water Res. 130 (2018) 139–150.
- [77] L. Wang, L. Yuan, Z. Li, X. Zhang, G. Sheng, Quantifying the occurrence and transformation potential of extracellular polymeric substances (EPS)-associated antibiotic resistance genes in activated sludge, J. Hazard Mater. 408 (2021b), 124428.
- [78] G. Sheng, H. Yu, X. Li, Extracellular polymeric substances (EPS) of microbial aggregates in biological wastewater treatment systems: a review, Biotechnol. Adv. 28 (6) (2010) 882–894.
- [79] Z. Ding, I. Bourven, G. Guibaud, E.D. van Hullebusch, A. Panico, F. Pirozzi, G. Esposito, Role of extracellular polymeric substances (EPS) production in bioaggregation: application to wastewater treatment, Appl. Microbiol. Biotechnol. 99 (23) (2015) 9883–9905.
- [80] M.V. Riquelme Breazeal, J.T. Novak, P.J. Vikesland, A. Pruden, Effect of wastewater colloids on membrane removal of antibiotic resistance genes, Water Res. 47 (1) (2013) 130–140.
- [81] X. Hou, S. Liu, Z. Zhang, Role of extracellular polymeric substance in determining the high aggregation ability of anammox sludge, Water Res. 75 (2015) 51–62.
- [82] C. Yin, F. Meng, G. Chen, Spectroscopic characterization of extracellular polymeric substances from a mixed culture dominated by ammoniaoxidizing bacteria, Water Res. 68 (2015) 740–749.
- [83] K. Saeki, Y. Ihyo, M. Sakai, T. Kunito, Strong adsorption of DNA molecules on humic acids, Environ. Chem. Lett. 9 (4) (2011) 505–509.
- [84] T. Zhu, Z. Su, W. Lai, Y. Zhang, Y. Liu, Insights into the fate and removal of antibiotics and antibiotic resistance genes using biological wastewater treatment technology, Sci. Total Environ. 776 (2021), 145906.
- [85] G. Sheng, H. Yu, Characterization of extracellular polymeric substances of aerobic and anaerobic sludge using three-dimensional excitation and emission matrix fluorescence spectroscopy, Water Res. 40 (6) (2006) 1233–1239.
- [86] Y. Shi, X. Wang, Z. Qi, M. Diao, M. Gao, S. Xing, S. Wang, X. Zhao, Sorption and biodegradation of tetracycline by nitrifying granules and the toxicity of tetracycline on granules, J. Hazard Mater. 191 (1) (2011) 103–109.
- [87] L. Zhu, J. Zhou, M. Lv, H. Yu, H. Zhao, X. Xu, Specific component comparison of extracellular polymeric substances (EPS) in flocs and granular sludge using EEM and SDS-PAGE, Chemosphere 121 (2015) 26–32.
- [88] C. Gu, P. Gao, F. Yang, D. An, M. Munir, H. Jia, G. Xue, C. Ma, Characterization of extracellular polymeric substances in biofilms under long-term exposure to ciprofloxacin antibiotic using fluorescence excitation-emission matrix and parallel factor analysis, Environ. Sci. Pollut. Res. 24 (15) (2017) 13536–13545.
- [89] X. Zhang, Z. Chen, Y. Ma, T. Chen, J. Zhang, H. Zhang, S. Zheng, J. Jia, Impacts of erythromycin antibiotic on Anammox process: performance and microbial community structure, Biochem. Eng. J. 143 (2019d) 1–8.
- [90] L. Yan, W. Chen, C. Wang, S. Liu, C. Liu, L. Yu, Y. Zheng, J. Jiang, Y. Zhang, C. Xia, S.S. Lam, Tetracycline removal in granulation: influence of extracellular polymers substances, structure, and metabolic function of microbial community, Chemosphere 288 (2022), 132510.
- [91] A. Kaewmanee, W. Chiemchaisri, C. Chiemchaisri, Influence of high doses of antibiotics on anoxic-aerobic membrane bioreactor in treating solid waste leachate, Int. Biodeterior. Biodegrad. 138 (2019) 15–22.
- [92] P. Zhang, B. Feng, Y. Chen, Y. Dai, J. Guo, In situ characterizations for EPSinvolved microprocesses in biological wastewater treatment systems, Crit. Rev. Environ. Sci. Technol. 49 (11) (2019c) 917–946.
- [93] A.C. Avella, M. Essendoubi, J.N. Louvet, T. Görner, G.D. Sockalingum, M.N. Pons, M. Manfait, P. de Donato, Activated sludge behaviour in a batch reactor in the presence of antibiotics: study of extracellular polymeric substances, Water Sci. Technol. 61 (12) (2010) 3147–3155.
- [94] J. Fu, D. Huang, Y. Bai, Y. Shen, X. Lin, Y. Huang, Y. Ling, N. Fan, R. Jin, How anammox process resists the multi-antibiotic stress: resistance gene accumulation and microbial community evolution, Sci. Total Environ. 807 (2022), 150784.
- [95] R. Métivier, I. Bourven, J. Labanowski, G. Guibaud, Interaction of erythromycin ethylsuccinate and acetaminophen with protein fraction of extracellular polymeric substances (EPS) from various bacterial aggregates, Environ. Sci. Pollut. Res. 20 (10) (2013) 7275–7285.
- [96] W. Ma, J. Zhang, Y. Wang, G. Li, X. Wu, Y. Yao, Y. Cheng, B. Huang, R. Jin, Extracellular polymeric substances excreted by anammox sludge act as a barrier for As(III) invasion: binding property and interaction mechanism, Chemosphere 278 (2021b), 130414.
- [97] T. Lotti, E. Carretti, D. Berti, M.R. Martina, C. Lubello, F. Malpei, Extraction,

recovery and characterization of structural extracellular polymeric substances from anammox granular sludge, J. Environ. Manag. 236 (2019) 649–656.

- [98] W. Wang, Y. Yan, J. Wang, Y. Zhu, J. Ma, Z. Jiang, Y. Wang, Comparison and optimization of extraction methods of extracellular polymeric substances in anammox granules: from maintaining protein secondary structure perspective, Chemosphere 259 (2020), 127539.
- [99] C. Le, C. Kunacheva, D.C. Stuckey, Protein" measurement in biological wastewater treatment systems: a critical evaluation, Environ. Sci. Technol. 50 (6) (2016) 3074–3081.
- [100] X. Liu, J. Liu, D. Deng, R. Li, C. Guo, J. Ma, M. Chen, Investigation of extracellular polymeric substances (EPS) in four types of sludge: factors influencing EPS properties and sludge granulation, J. Water Proc. Eng. 40 (2021b), 101924.
- [101] L. Miao, Q. Zhang, S. Wang, B. Li, Z. Wang, S. Zhang, M. Zhang, Y. Peng, Characterization of EPS compositions and microbial community in an Anammox SBBR system treating landfill leachate, Bioresour. Technol. 249 (2018) 108–116.
- [102] L. Ni, Y. Wang, X. Lin, Y. Yan, Y. Zhang, W. Wang, Enhancement of the adaptability of anammox granules to zinc shock by appropriate organic carbon treatment, Bioresour. Technol. 268 (2018) 496–504.
- [103] H. Wang, H. Deng, L. Ma, L. Ge, The effect of carbon source on extracellular polymeric substances production and its influence on sludge floc properties, J. Chem. Technol. Biotechnol. 89 (4) (2014) 516–521.
- [104] V.R.A. Ferreira, C.L. Amorim, S.M. Cravo, M.E. Tiritan, P.M.L. Castro, C.M.M. Afonso, Fluoroquinolones biosorption onto microbial biomass: activated sludge and aerobic granular sludge, Int. Biodeterior. Biodegrad. 110 (2016) 53–60.
- [105] R.K. Langbehn, C. Michels, H.M. Soares, Antibiotics in wastewater: from its occurrence to the biological removal by environmentally conscious technologies, Environ. Pollut. 275 (2021), 116603.
- [106] L. García, J.C. Leyva-Díaz, E. Díaz, S. Ordóñez, A review of the adsorptionbiological hybrid processes for the abatement of emerging pollutants: removal efficiencies, physicochemical analysis, and economic evaluation, Sci. Total Environ. 780 (2021), 146554.
- [107] Z. Yu, X. Zhang, H.H. Ngo, W. Guo, H. Wen, L. Deng, Y. Li, J. Guo, Removal and degradation mechanisms of sulfonamide antibiotics in a new integrated aerobic submerged membrane bioreactor system, Bioresour. Technol. 268 (2018) 599–607.
- [108] Q. Liao, H. Rong, M. Zhao, H. Luo, Z. Chu, R. Wang, Interaction between tetracycline and microorganisms during wastewater treatment: a review, Sci. Total Environ. 757 (2021), 143981.
- [109] Y. Lyu, J. Yu, M. Guo, K. Wang, Z. Yu, L. Zhang, Y. Zhang, L. Chen, New insights into interaction of proteins in extracellular polymeric substances of activated sludge with ciprofloxacin using quartz crystal microbalance with dissipation, Chemosphere 263 (2021), 128044.
- [110] B. Tiwari, B. Sellamuthu, Y. Ouarda, P. Drogui, R.D. Tyagi, G. Buelna, Review on fate and mechanism of removal of pharmaceutical pollutants from wastewater using biological approach, Bioresour. Technol. 224 (2017) 1–12.
- [111] D.A.M. Alexandrino, A.P. Mucha, C.M.R. Almeida, W. Gao, Z. Jia, M.F. Carvalho, Biodegradation of the veterinary antibiotics enrofloxacin and ceftiofur and associated microbial community dynamics, Sci. Total Environ. 581–582 (2017) 359–368.
- [112] M. Harrabi, D.A.M. Alexandrino, F. Aloulou, B. Elleuch, B. Liu, Z. Jia, C.M.R. Almeida, A.P. Mucha, M.F. Carvalho, Biodegradation of oxytetracycline and enrofloxacin by autochthonous microbial communities from estuarine sediments, Sci. Total Environ. 648 (2019) 962–972.
- [113] A.S. Maia, A.R. Ribeiro, C.L. Amorim, J.C. Barreiro, Q.B. Cass, P.M.L. Castro, M.E. Tiritan, Degradation of fluoroquinolone antibiotics and identification of metabolites/transformation products by liquid chromatography-tandem mass spectrometry, J. Chromatogr. A 1333 (2014) 87–98.
- [114] L. Wang, Z. Qiang, Y. Li, W. Ben, An insight into the removal of fluoroquinolones in activated sludge process: sorption and biodegradation characteristics, J. Environ. Sci.-China 56 (2017) 263–271.
- [115] X. Song, D. Liu, G. Zhang, M. Frigon, X. Meng, K. Li, Adsorption mechanisms and the effect of oxytetracycline on activated sludge, Bioresour. Technol. 151 (2014) 428–431.
- [116] B. Li, T. Zhang, Biodegradation and adsorption of antibiotics in the activated sludge process, Environ. Sci. Technol. 44 (9) (2010) 3468–3473.
- [117] K. He, A.D. Soares, H. Adejumo, M. McDiarmid, K. Squibb, L. Blaney, Detection of a wide variety of human and veterinary fluoroquinolone antibiotics in municipal wastewater and wastewater-impacted surface water, J. Pharmaceut. Biomed. 106 (2015) 136–143.
- [118] W. Li, H. Yu, Insight into the roles of microbial extracellular polymer substances in metal biosorption, Bioresour. Technol. 160 (2014) 15–23.
- [119] Z. Pei, X. Shan, J. Kong, B. Wen, G. Owens, Coadsorption of ciprofloxacin and Cu(II) on montmorillonite and kaolinite as affected by solution pH, Environ. Sci. Technol. 44 (3) (2010) 915–920.
- [120] D. Perez-Guaita, S. Boudesocque, S. Sayen, E. Guillon, Cu(II) and Zn(II) complexes with a fluoroquinolone antibiotic: spectroscopic and X-ray absorption characterization, Polyhedron 30 (2) (2011) 438–443.
- [121] G. Chen, X. Shan, Z. Pei, H. Wang, L. Zheng, J. Zhang, Y. Xie, Adsorption of diuron and dichlobenil on multiwalled carbon nanotubes as affected by lead, J. Hazard Mater. 188 (1) (2011) 156–163.
- [122] Y. Wang, Z. Pei, X. Shan, G. Chen, J. Zhang, Y. Xie, L. Zheng, Effects of metal

cations on sorption-desorption of p-nitrophenol onto wheat ash, J. Environ. Sci.-China 23 (1) (2011) 112–118.

- [123] M. Zou, W. Tian, J. Zhao, M. Chu, T. Song, Quinolone antibiotics in sewage treatment plants with activated sludge treatment processes: a review on source, concentration and removal, Process Saf. Environ. 160 (2022) 116–129.
- [124] S. Hu, Y. Zhang, G. Shen, H. Zhang, Z. Yuan, W. Zhang, Adsorption/desorption behavior and mechanisms of sulfadiazine and sulfamethoxazole in agricultural soil systems, Soil Tillage Res. 186 (2019) 233–241.
- [125] D. Gao, Z. Wen, B. Li, H. Liang, Membrane fouling related to microbial community and extracellular polymeric substances at different temperatures, Bioresour. Technol. 143 (2013) 172–177.
- [126] J. Feng, Z. Yang, G. Zeng, J. Huang, H. Xu, Y. Zhang, S. Wei, L. Wang, The adsorption behavior and mechanism investigation of Pb(II) removal by flocculation using microbial flocculant GA1, Bioresour. Technol. 148 (2013) 414–421.
- [127] W. Wei, Q. Wang, A. Li, J. Yang, F. Ma, S. Pi, D. Wu, Biosorption of Pb (II) from aqueous solution by extracellular polymeric substances extracted from Klebsiella sp. J1: adsorption behavior and mechanism assessment, Sci. Rep.-UK 6 (1) (2016), 31575.
- [128] S. Ghorai, A. Sinhamahpatra, A. Sarkar, A.B. Panda, S. Pal, Novel biodegradable nanocomposite based on XG-g-PAM/SiO<sub>2</sub>: application of an efficient adsorbent for Pb<sup>2+</sup> ions from aqueous solution, Bioresour. Technol. 119 (2012) 181–190.
- [129] S. Prasertkulsak, C. Chiemchaisri, W. Chiemchaisri, K. Yamamoto, Removals of pharmaceutical compounds at different sludge particle size fractions in membrane bioreactors operated under different solid retention times, J. Hazard Mater. 368 (2019) 124–132.
- [130] Y. Chen, Z. Wang, L. Liu, H. Zhao, P. Wu, Stress-responses of microbial population and activity in activated sludge under long-term ciprofloxacin exposure, J. Environ. Manag. 281 (2021), 111896.
- [131] J. Xue, D. Lei, X. Zhao, Y. Hu, S. Yao, K. Lin, Z. Wang, C. Cui, Antibiotic residue and toxicity assessment of wastewater during the pharmaceutical production processes, Chemosphere 291 (2022), 132837.

- [132] X. Dai, C. Su, Z. Chen, X. Li, P. Lu, Z. Qi, Z. Luo, M. Chen, Sulfonamide and quinolone antibiotics contaminated wastewater treatment by constructed rapid infiltration: efficiency and microbial community structure, Process Saf. Environ. 161 (2022) 542–555.
- [133] Y. Cheng, G. Li, Y. Liu, B. Zhu, Q. Zhang, Y. Xue, Z. Zhang, R. Jin, Evaluating the effects of Zn(II) on high-rate biogranule-based denitrification: performance, microbial community and sludge characteristics, Bioresour. Technol. 279 (2019) 393–397.
- [134] L. Cui, L. Fan, Z. Li, J. Wang, R. Chen, Y. Zhang, J. Cheng, X. Wu, J. Li, H. Yin, W. Zeng, L. Shen, Characterization of extracellular polymeric substances from Synechocystis sp. PCC6803 under Cd (II), Pb (II) and Cr (VI) stress, J. Environ. Chem. Eng. 9 (4) (2021), 105347.
- [135] H. Wang, C. Hu, Y. Shen, B. Shi, D. Zhao, X. Xing, Response of microorganisms in biofilm to sulfadiazine and ciprofloxacin in drinking water distribution systems, Chemosphere 218 (2019) 197–204.
- [136] W.O. Khunjar, N.G. Love, Sorption of carbamazepine, 17α-ethinylestradiol, iopromide and trimethoprim to biomass involves interactions with exocellular polymeric substances, Chemosphere 82 (6) (2011) 917–922.
- [137] C. Ren, Y. Wang, L. Tian, M. Chen, J. Sun, L. Li, Genetic bioaugmentation of activated sludge with dioxin-catabolic plasmids harbored by Rhodococcus sp. strain p52, Environ. Sci. Technol. 52 (9) (2018) 5339–5348.
  [138] B. Khatiwada, A. Sunna, H. Nevalainen, Molecular tools and applications of
- [138] B. Khatiwada, A. Sunna, H. Nevalainen, Molecular tools and applications of Euglena gracilis: from biorefineries to bioremediation, Biotechnol. Bioeng. 117 (12) (2020) 3952–3967.
- [139] A.B. Rios Miguel, M.S.M. Jetten, C.U. Welte, The role of mobile genetic elements in organic micropollutant degradation during biological wastewater treatment, Water Res. X 9 (2020), 100065.
- [140] Q. Xiong, L. Hu, Y. Liu, J. Zhao, L. He, G. Ying, Microalgae-based technology for antibiotics removal: from mechanisms to application of innovational hybrid systems, Environ. Int. 155 (2021), 106594.
- [141] L. Wei, F. Zhu, Q. Li, C. Xue, X. Xia, H. Yu, Q. Zhao, J. Jiang, S. Bai, Development, current state and future trends of sludge management in China: based on exploratory data and CO<sub>2</sub>-equivalent emissions analysis, Environ. Int. 144 (2020), 106093.