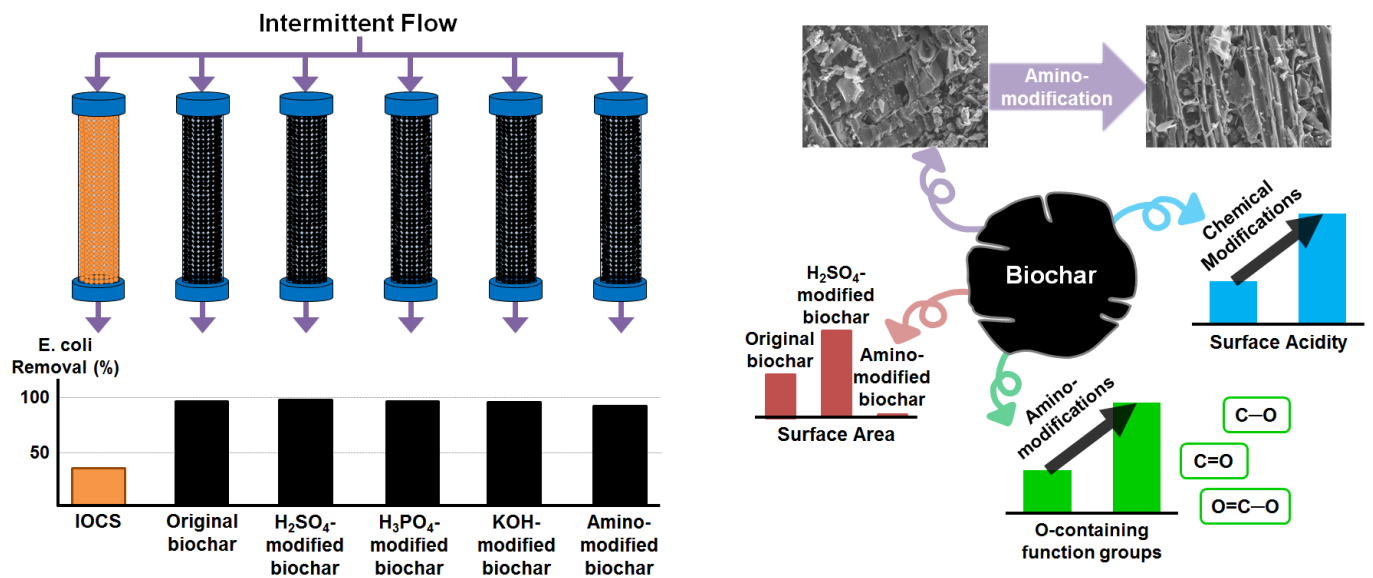


Surface-Modified Biochar in a Bioretention System for *Escherichia coli* Removal from Stormwater

Abbe Y.T. Lau^a, Daniel C.W. Tsang^{a,*}, Nigel J.D. Graham^b, Yong Sik Ok^c, Xin Yang^d, Xiangdong Li^a

Graphical Abstract:



Highlights:

- Biochar was an effective bioretention filter media for *E. coli* removal
- H₂SO₄-modified biochar improved *E. coli* retention and reduced remobilization
- H₂SO₄-modification doubled surface area of original biochar
- Amino-modification enriched O-containing group density and reduced porosity
- Biochar properties played a significant role in fate and transport of *E. coli*

1 **Surface-Modified Biochar in a Bioretention System for *Escherichia coli***

2 **Removal from Stormwater**

3

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16 Abstract

17 Bioretention systems have been recommended as one of the best management practices for
18 low impact development for water recycling/reuse systems. Although improvement of the
19 stormwater quality has been reported regarding pollutants eliminations such as suspended
20 solids and heavy metals, a substantial removal of indicator bacteria is required for possible
21 non-potable reuse. This study investigated the efficiency of wood biochar with H₂SO₄-,
22 H₃PO₄-, KOH-, and amino-modifications for *E. coli* removal from synthetic stormwater
23 under intermittent flow. The H₂SO₄-modified biochar showed a specific surface area of 234.7
24 m² g⁻¹ (approximately double the area of original biochar), whereas a substantial reduction in
25 surface area was found with amino-modified biochar. The *E. coli* removal (initial
26 concentration of 0.3-3.2×10⁶ CFU mL⁻¹) by modified biochars as filter media was very
27 promising with, for example, over 98% removal efficiency in the first 20 pore volumes of
28 stormwater infiltration and over 92% removal by the end of the second infiltration cycle.
29 Only a small portion of *E. coli* attached on the modified biochars (< 0.3%, except KOH- and
30 amino-modified biochars) was remobilized during the drainage phase of intermittent flow.
31 The high removal capacity and stability against drainage were attributed to the high surface
32 area, porous structure, and surface characteristics (e.g. hydrophobicity and O-containing
33 functional groups) of the biochars. Thus, the H₂SO₄-modified biochar appeared to give the
34 best treatment performance.

35 *Keywords:* bacteria removal; bioretention systems; designer biochar; intermittent flow;
36 stormwater harvesting.

37 **1. Introduction**

38 In recent years, substitution, regeneration, and reduction are suggested as complementary
39 approaches for improving water productivity and ecosystem sustainability (Grant et al., 2012).
40 The substitution approach uses lower-quality water (such as reclaimed wastewater) to replace
41 higher-quality drinking water for non-potable municipal, industrial, and agricultural activities.
42 Although the Pearl River Delta region is increasingly water-stressed as a result of
43 industrialization, urbanization, and population growth in industrial and commercial centres
44 (Civic Exchange, 2011), Hong Kong relies heavily on the imported water from the Dongjiang
45 River (70-80% of total supply) because of insufficient local yield from rainfall capture (HK
46 WSD, 2016). Hence, rainwater harvesting systems have been implemented in public housings,
47 shopping centres, and government buildings in Hong Kong, which is estimated to save up to
48 50% of water for landscape irrigation in the neighbourhood (HK GBC, 2014). In addition,
49 stormwater is currently collected and discharged into receiving water bodies via separate
50 drainage systems (HK DSD, 2013), which can potentially be harvested for non-potable uses
51 with an adoption of low impact development approach as an alternative to traditional
52 stormwater drainage design in new town development.

53 Bioretention systems are passive and chemical-free methods for capturing and treating
54 stormwater at source (CIRIA, 2015; Water by Design, 2014), which have proved efficient in
55 reducing runoff volumes and concentrations of suspended solids, total nitrogen and
56 phosphorus, as well as heavy metals (Davis et al., 2009; Roy-Poirier et al., 2010; Stagge et al.,
57 2012). For removal of microorganisms, the performance of bioretention is more variable
58 depending on the watershed characteristics, surrounding hydrogeology, etc. Pathogen
59 concentrations in surface runoff vary significantly throughout the year from 10^1 to 10^6 colony
60 forming units (CFU) per 100 mL of stormwater depending on the land use and catchment
61 area/type (Lundy et al., 2012). Faecal indicator bacteria in urban runoff, such as *Escherichia*

62 *coli* (*E. coli*) and total coliforms, are identified as one of the leading causes of impairments to
63 surface waters (Arnone and Walling, 2007; Gaffield et al., 2003), as their presence indicates
64 the likelihood of contamination by viruses, protozoans, and pathogenic bacteria that may
65 cause public waterborne illnesses. A recent study has suggested that viral health risks
66 associated with the use of harvested urban stormwater for crop irrigation would be deemed
67 unacceptable based on the recommendations of the World Health Organization (Lim et al.,
68 2015).

69 Continued research on improvements to the filter media is needed to enhance the
70 performance of bioretention systems for bacteria removal from stormwater. Biochar, a
71 carbon-dense solid residue produced from biomass pyrolysis, has shown a good potential as
72 bioretention media for improving *E. coli* removal (Abit et al., 2012; Bolster and Abit, 2012).
73 Recent studies have provided a solid scientific foundation and promising evidence for
74 utilizing biochar in the bioretention filter media for removing bacteria from stormwater in the
75 co-presence of natural organic matter and throughout intermittent flows between storm events
76 (Mohanty et al, 2013; Mohanty et al., 2014). However, the effectiveness appears to vary with
77 the qualities and properties of the biochar (Mohanty and Boehm, 2015). On top of these
78 findings, this study endeavours the post-synthesis chemical modifications to tailor both
79 physical and chemical properties of biochar and examine their influences on *E. coli* removal.
80 Our findings are expected to inform the design of engineered biochar and enhance the
81 technical feasibility of biochar utilization in bioretention applications.

82 The adsorption capacity of biochar is widely recognized to depend on its
83 physicochemical characteristics (Ahmad et al., 2016; Beiyuan et al., 2016; Fang et al., 2016;
84 Zhang et al., 2015). In addition to feedstock types and pyrolysis conditions, both the physical
85 characteristics (e.g., surface area and pore size distribution) and surface chemistry (e.g.,
86 functional group density and point of zero charge) of biochar can be tailored by physical or

87 chemical activations (Rajapaksha et. al, 2016a; 2016b). For instance, H₃PO₄-, KOH-, and
88 H₂SO₄-modifications of biochar were found to extensively increase the microporosity and
89 surface area as well as enriched the density of oxygen-containing functional groups (Lin et al.,
90 2012; Liu et al., 2008; Rajapaksha et. al, 2016a; Tsang et al., 2007). In addition, amino
91 moieties chemically bonded onto biochars enabled strong surface complexation for
92 contaminant immobilization (Yang and Jiang, 2014). Thus, chemically-modified biochar as a
93 filter media in bioretention systems may promote the bacteria removal from stormwater.

94 This study has evaluated the *E. coli* removal efficiency of four surface-modified biochars,
95 specifically, an amino-modified biochar (AB), a KOH-modified biochar (KB), a H₃PO₄-
96 modified biochar (PB) and a H₂SO₄-modified biochar (SB), in comparison to an original
97 biochar (BC) in a simplified bioretention column under intermittent flows that imitate real
98 storm events. The engineered biochars were comprehensively characterized in terms of
99 surface area and pore size distribution (BET and BJH analysis of nitrogen gas adsorption),
100 density of acidic/alkaline groups (Boehm's titration), microscopic imaging with elemental
101 mapping (scanning electron microscopy/energy dispersive spectroscopy, SEM/EDS), and
102 identification of surface functional groups (X-ray photoelectron spectroscopy, XPS) for
103 elucidating the observed performance in bacteria removal.

104

105 **2. Materials and Methods**

106 *2.1. Synthetic Stormwater*

107 Synthetic stormwater solutions were prepared using deionized water and the following
108 salts with reference to recent studies (Mohanty et al., 2013; 2014; Mohanty and Boehm,
109 2015): 5.1 mM NaCl, 0.75 mM CaCl₂, 0.0075 mM MgCl₂, 0.33 mM Na₂SO₄, 1 mM NaHCO₃,
110 0.072 mM NaNO₃, 0.072 mM NH₄Cl, and 0.016 mM Na₂HPO₄. The pH was adjusted using
111 either 0.1 M HCl or 0.1 M NaOH to 7.0 ± 1. All chemicals were purchased from Sigma-

112 Aldrich. The solutions were autoclaved (121 °C, 100 kPa, 30 min) before use. Escherichia
113 coli K12 (ATCC 10798) was selected as the model bacteria because of the higher persistence
114 of gram-negative, rather than gram-positive, bacteria, and it was cultured as described in
115 previous studies (Mohanty et al., 2013; 2014). Tryptone Soya Agar (TSA) and Tryptone Soya
116 Broth (TSB) were acquired from Oxoid (UK). A TSA plate, streaked with a loop of preserved
117 strains (stored in 25% glycerol at -80 °C) was incubated at 37 °C for 24 h. A single colony
118 was transferred into 20 mL TSB and incubated at 37 °C for 8 h. A 20 µL quantity of the
119 culture was transferred to the second batch of 20 mL TSB and incubated at 37 °C for 16 h.
120 The harvested culture was centrifuged at 4000 rpm for 10 min. To remove the growth media,
121 the pellet was rinsed with phosphate buffer saline twice. The cells were pelletized and re-
122 suspended in synthetic stormwater to achieve a suspension of $0.3-3.2 \times 10^6$ CFU mL⁻¹. The
123 bacterial suspension was conditioned with stormwater at 4 °C for 16-18 h and warmed to
124 room temperature in a water bath immediately before the experiments.

125

126 2.2. Bioretention Filter Media

127 In typical bioretention systems, surface runoff gradually percolates through the filter
128 layer (i.e., bioretention soil), the transition layer, and drainage layer, and then passes via
129 underlying perforated pipes to a storage tank before reuse. In order to cater for the high
130 rainfall intensity in Hong Kong due to its subtropical climate (average annual rainfall of 2400
131 mm), acid-washed Ottawa sand (AWS) and iron oxide-coated sand (IOCS) were used as the
132 filter media. The corresponding preparation methods are described in the Supplementary
133 Information. The biochar (supplied by Kadoorie Farm and Botanic Garden in Hong Kong)
134 was produced from forestry wood waste (*Acacia confusa* and *Celtis sinensis*) by slow
135 pyrolysis up to 700 °C for at least 15 h. The biochar was ground and sieved to be below 1.18
136 mm before use.

137 The H₃PO₄- and KOH-modified biochars were prepared following the methods by Lin et
138 al. (2012), and the H₂SO₄-modified biochar was prepared according to Liu et al. (2012).
139 Briefly, original biochar was heated and stirred with either 1 M H₃PO₄ or 0.1 M KOH at 90
140 °C, or with 10% H₂SO₄ (v/v) at 60-70 °C for 1 h, then cooled down to room temperature. The
141 biochar was filtered and rinsed using deionized water until the pH of the eluate was
142 approximately neutral. The acid-/alkali-modified biochar was dried at 60 °C for 24 h. The
143 amino-modification was conducted following the method by Yang and Jiang (2014). Briefly,
144 original biochar was stirred with concentrated H₂SO₄ and concentrated HNO₃ in a water-ice
145 bath for 2 h and then warmed to room temperature. The solid was filtered and rinsed with
146 deionized water and subsequently isopropanol, and then dried at 90 °C for 24 h to remove
147 isopropanol. The dried biochar was stirred with deionized water and 15 M ammonium
148 hydroxide for 15 min, followed by addition of Na₂S₂O₄ and stirring for another 20 h. Then,
149 2.9 M acetic acid was added and stirred for 15 min. After 5-h reflux at 100 °C, the suspension
150 was cooled to room temperature, filtered, and washed with deionized water and isopropanol.
151 Finally, the amino-modified biochar was dried at 90 °C overnight.

152

153 2.3. Characterization of Original/Modified Biochars

154 The surface acidic and basic groups of biochars were determined using Boehm's titration
155 method (Boehm, 1994). Briefly, 0.1 g sample of original biochar, KB, or PB was added to 10
156 mL of 0.05 M HCl, NaHCO₃, NaOH, and Na₂CO₃, respectively, while for the SB and AB
157 samples a mass of 0.2 g and 0.4 g, respectively, was used instead. The samples were
158 equilibrated for 24 h and filtered. Each filtrate was added with excess HCl to ensure the
159 complete neutralization of bases, followed by back titration with NaOH using an auto-titrator
160 (AT 400 and APB 410, Kyoto Electronics). The specific surface area (Brunauer–Emmett–
161 Teller, BET) and pore volume distribution (Barrett–Joyner–Halenda, BJU) of biochars were

162 determined from N₂ adsorption-desorption isotherms at 77 K using a gas sorption analyser
163 (NOVA-1200, Quantachrome Corporation). The micropore volume and surface area were
164 calculated by the t-plot method.

165 The morphology of biochar samples was observed with a scanning electron microscope
166 (SEM, Model JSM-6380LV, JEOL) equipped with an energy-dispersive spectrometer at 20
167 kV (EDS, INCA X-sight, Oxford Instruments). Thermogravimetric analysis was performed
168 using a thermogravimetric analyser (TGA, STA 449C Jupiter, Netzch) with nitrogen
169 stripping gas at a heating rate of 10 °C min⁻¹. The XPS spectra of the biochars were obtained
170 using a PHI Quantera spectrometer (USA). The binding energies were referenced to the C1s
171 peak at 284.6 eV for calibration. The deconvolution of XPS peaks was conducted using by
172 XPSPEAK (version 4.1) software with % Gaussian-Lorentzian of 30% and Shirley
173 background subtraction.

174

175 *2.4. Bioretention Column Experiments*

176 Each glass chromatography column (Kontes, 2.5-cm diameter, 15-cm length) was packed
177 with a mixture of AWS (90% w/w), IOCS (5% w/w), and biochar (5% w/w). All filter media
178 were autoclaved (121 °C, 100 kPa, 20 min) before dry-packing. The whole column set-up,
179 including tubing, was sterilized with 70% ethanol prior to packing. The pore volume (PV)
180 was estimated to be 28.5 mL by subtracting the weight of the dry-packed column from the
181 completely saturated column. To remove air from pores between packed filter media grains
182 and equilibrate the filter media, 20 PV of sterile synthetic stormwater was injected upward
183 through the columns before the experiments (Mohanty et al., 2013; 2014).

184 In order to imitate real storm events, there were three phases for the column experiments:
185 an adsorption phase in saturated conditions, a desorption phase in saturated conditions before
186 drainage, and a desorption phase in unsaturated conditions after drainage. About 10 PV of

187 synthetic stormwater with *E. coli* concentration of $0.3\text{-}3.2\times 10^6$ CFU mL⁻¹, followed by 10 PV
188 of sterile synthetic stormwater, was pumped upward at 2 mL min⁻¹ from the bottom inlet.
189 Subsequently, the flow was stopped and then the column was turned over (180°) for draining
190 the pore water by gravity for 20 min (i.e., consistent with inflow direction) during the
191 drainage phase. After the gravity drainage, the drained column was returned to its original
192 direction and sealed for 16 h. 5 PV of sterile synthetic stormwater was then injected upward
193 through the column. The cycle of infiltration and drainage phases was repeated, as illustrated
194 in Figure S1 (Supplementary Information). The effluent samples were regularly collected
195 every 1 PV, and the bacterial concentrations (CFU mL⁻¹) in the influent (C_o) and effluent (C)
196 samples were enumerated by spread plating techniques using three decimal dilutions.
197 Duplicate plates with 30 to 300 CFU per plate were used to obtain an average *E. coli*
198 concentration. All experiments were conducted in duplicate.

199

200 **3. Results and Discussion**

201 *3.1. Original and modified biochars*

202 As shown in Table 1, both H₃PO₄- and H₂SO₄-modifications increased the specific
203 surface area (S_{BET}) and total pore volume (V_{total}) of original biochar from 137.0 m² g⁻¹ and
204 0.0622 m³ g⁻¹ to 160.9 m² g⁻¹ and 0.0733 m³ g⁻¹ for PB, or 230.6 m² g⁻¹ and 0.1052 m³ g⁻¹ for
205 SB, respectively, which is favourable for *E. coli* adsorption. The wet sulphuric oxidation
206 process may lead to the considerable creation and enlargement of pores via carbon
207 gasification, accounting for a significant increase in the specific surface area and total pore
208 volume (Foo et al., 2012; Guo et al., 2005). However, there was a slight decrease in the
209 corresponding values for KB (113.8 m² g⁻¹ and 0.0557 m³ g⁻¹) and a substantial reduction
210 with AB (2.63 m² g⁻¹ and 0.0032 m³ g⁻¹). This may have resulted from the remarkable
211 destruction of pores during highly oxidative acidic modification (Figure S2) and pore

212 blockage by the amino functional groups grafted onto AB, which were similarly observed in
213 the latest studies (Kang et al., 2016; Li et al., 2016).

214 The SEM images show porous surface structures of the biochars (Figure 1), which have
215 no drastic change in their porous characteristics after H₂SO₄-, H₃PO₄- and KOH-
216 modifications. The pore structures of SB, PB, and KB were largely composed of micropores
217 with the $V_{\text{micro}}/V_{\text{total}}$ ratio in the range 78.6-86.4% (comparable to 82.0% in BC). However,
218 the SEM image of AB at a higher magnification displays an open network of large
219 macropores in the size of 10-20 μm (Figure S2). The $V_{\text{micro}}/V_{\text{total}}$ ratio of AB was 23.4% only,
220 suggesting that the amino-modification was too chemically aggressive and resulted in the
221 collapse of micropores and the development of a mesoporous structure, as illustrated in
222 Figure 2. This was corroborated by the large average pore diameter of AB (4.85 nm)
223 compared to the others (1.82-1.96 nm) in Table 1.

224 Based on the results of the Boehm's titration (Table 1), the chemically-modified biochars
225 were found to have 0.703 to 2.359 mmol g⁻¹ of surface acidic groups, which were 1.5 to 5.2
226 times of that of BC. The presence of carboxylic groups and phenolic groups on the biochars,
227 and their changes as a result of chemical modifications, were confirmed by XPS spectra
228 (Figure 3) and the corresponding elemental compositions (Table S1). The high-resolution C1s
229 and O1s peaks were present on all biochars, whereas the N1s peaks only were displayed by
230 BC, AB, and KB.

231 The deconvolution of C1s spectra revealed the presence of five component peaks (Figure
232 3), corresponding to graphitic carbon C=C or hydrocarbon C-C (Peak 1, 284.55-284.79 eV),
233 carbon in phenol, alcohol C-O, C=N or CNH₂ (Peak 2, 285.64-286.04 eV), C=O bonds in
234 carbonyl groups (Peak 3, 286.65-287.44 eV), O=C-O bonds in carboxyl or ester groups
235 (Peak 4, 288.44-288.98 eV), and shake-up satellite peaks due to a $\pi-\pi^*$ transition in aromatic
236 rings (Peak 5, 290.27-290.87 eV) (Georgiou et al., 2010; Yue et al., 1999). It was evident that

237 the specific surface areas of modified biochar reduced with increasing O-containing
238 functional groups (i.e., C=O, O=C–O, C–O) (Table S2), or increasing oxygen content on the
239 surfaces (Table S1).

240 The O1s spectra were resolved into four peaks (Figure S3): oxygen in carbonyl group
241 C=O (Peak 1, 530.90-531.48 eV), oxygen in hydroxyl or ether groups C–O (Peak 2, 532.23-
242 532.46 eV), oxygen in carboxyl or ester groups O=C–O (Peak 3, 533.21-533.50 eV), and
243 chemisorbed oxygen or adsorbed water (Peak 4, 534.01-536.33 eV) (Georgiou et al., 2010;
244 Walczyk et al., 2005; Yue et al., 1999). The N1s spectra of BC, KB, and AB were fitted into
245 two individual peaks (Figure S4): C=N (Peak 1, 398.89-399.21 eV) and quaternary N or –NO
246 groups (Peak 2, 400.79-401.11 eV) (Jansen et al., 1995; Reis et al., 1995; Singh et al., 2014).
247 In comparison, nitrogen atoms in an amide or amine of ester (Peak 3, 399.71 eV) were found
248 in the N1s spectra after amino-modification. These deconvoluted peaks, along with the
249 increase in nitrogen content in the elemental composition (Table S1), indicated successful
250 grafting of amino groups on the surface of AB after modification.

251 Thermogravimetric analysis (Figure S5a) showed that BC was the most thermally stable
252 with 5% weight loss at ~345 °C, while the thermal stability of biochar deteriorated after the
253 chemical modifications. It was noted that the temperatures corresponding to 5% weight loss
254 in all chemically-modified biochars were below 100 °C (76 °C for SB, 57 °C for PB, 59 °C
255 for KB, and 67 °C for AB), indicating the removal of moisture from the biochars. Compared
256 to BC (3.4% of water content), there was a larger amount of adsorbed water in the SB, PB,
257 KB, and AB (6.5-9.7%). Thus, an introduction of hydroxyl groups during chemical
258 modifications altered the hydrophobic nature of the biochar to more hydrophilic.

259 There was an additional decomposition stage between 160 and 370 °C for AB, which
260 may be attributed to decarboxylation of carboxylic groups (Anstey et al., 2016). The
261 substantial weight loss above 350 °C may reflect the degradation of recalcitrant condensed

262 organic carbon (Chen and Huang, 2011) and conversion of carbon to CO, CO₂, and CH₄.
263 There was an obvious shift of the broad peak at 600 °C to 560 °C for KB (Figure S5b), which
264 may reflect the pore structure of the biochar was changed by KOH-modification, leading to a
265 collapse of micropores (Table 1), and thus deteriorating the thermal stability. From 800 °C
266 onwards, the degradation of lignocellulose substances in biochars was completed and the
267 curves remained unchanged. The reduction in residual masses also indicated a decrease in
268 thermal stability of the biochar after the studied chemical modifications.

269

270 3.2. *Effects of modified biochars on E. coli retention and remobilization*

271 The retention and remobilization of *E. coli* during intermittent infiltration cycles are
272 illustrated in Figure 4. The viable counts of *E. coli* in the influent were measured before and
273 after each infiltration cycle, and were maintained at a concentration of 10⁶ CFU mL⁻¹,
274 representing concentration on the high side of the reported range in stormwater (Lundy et al.,
275 2012). All columns with biochar removed 92.1% to 98.7% of the total amount of *E. coli*
276 injected in the entire storm event (Table 3). In contrast, the overall removal was only 35% in
277 the sand column packed with AWS (90% by weight) and IOCS (10% by weight) (Table 3).
278 The effluent bacterial concentrations generally increased with the continuous infiltration of
279 bacteria-containing stormwater. In the second infiltration cycle, a small decrease in removal
280 capacity (1.9-7.9%) was observed in SB, PB, and KB compared to the first infiltration cycle,
281 while the reduction was slightly more notable in AB (10.8%) (Table 3). Hence, biochars
282 showed promising *E. coli* removal capacities with low bacterial remobilization arising from
283 intermittent rainfall events.

284 Bacterial adhesion can be explained by Derjaguin-Landau-Verwey-Overbeek (DLVO)
285 theory (DeNovio et al., 2004; Hori & Matsumoto, 2010; van Loosdrecht et al., 1990). The
286 degree of attraction between surfaces of bacteria and filter media is determined by the net

287 interaction potential due to attractive van der Waals and repulsive electrostatic interactions.
288 Ionic strength reduction and pH increase can mobilize inorganic/organic colloids in both
289 saturated and unsaturated porous systems due to an enhanced electrostatic repulsion
290 (DeNovio et al., 2004). However, the increases in effluent pH attributed to additions of BC
291 (pH 7.1) and KB (pH 8.5) did not lower the bacterial retention in biochar columns, while the
292 effluent pH values in other columns (6.9 for PB, 6.8 for SB, 6.4 for AB) were comparable
293 with or slightly lower than the sand column (pH 6.9). Therefore, other mechanisms, e.g., pore
294 straining and hydrophobic attraction, may also account for the high *E. coli* deposition.

295 Although biochar also provides surface active sites for *E. coli* removal, the specific
296 receptor-ligand interactions may be exhausted over time due to continuous bacterial loading
297 in bioretention columns. The high removal efficiency of *E. coli* may be primarily attributed to
298 the large surface area of biochars (113.8-230.6 m² g⁻¹ given in Table 1, except AB) as
299 compared to sand and IOCS (0.82 m² g⁻¹). Yet, it is noted that pore sizes of 2 to 5 times
300 greater than the cell size are needed to maximize adhesion of microorganisms (Samonin and
301 Elikova, 2004), hence the specific surface area includes internal pores of biochars that are not
302 available for the attachment of *E. coli* (~0.8 μm diameter) (Pierucci, 1978).

303 The remobilization of attached *E. coli* from the biochar columns was marginal (0.2-2.0%)
304 during gravitational drainage and intermittent flow (Table 3), while a greater fraction of
305 deposited *E. coli* (4.6%) was mobilized from sand column despite its low removal during
306 stormwater infiltration. The bacterial transport in intermittent flows was possibly driven by
307 air-water interface scouring and induced shear force depending on the rainfall solution history
308 and soil heterogeneity (DeNovio et al., 2004; Mohanty et al., 2016). Only a minimal amount
309 of attached *E. coli* (0.04-0.33%) was eluted from biochar columns in the first gravitational
310 drainage. However, in the KB and AB columns, *E. coli* remobilization increased substantially
311 during the second gravitational drainage (1.43-4.44%). A net bacterial growth was less likely

312 during the 16-h pause in stationary phase (Finkel, 2006). Thus, the increase in bacterial
313 remobilization for the succeeding infiltration cycle may reflect less bacterial deposition by
314 straining due to loss of low-density biochar particles during intermittent flows (Mohanty and
315 Boehm, 2015; Wang et al., 2013).

316 A high overall removal of *E. coli* (96.6%) was achieved by original biochar in the
317 bioretention columns. The H₂SO₄ modification slightly increased the performance, especially
318 for minimizing the bacteria remobilization (Figure 4), while H₃PO₄ and KOH modifications
319 had little influence. In contrast, the amino-modified biochar, which has a high binding
320 affinity for cationic contaminants, compromised the effectiveness of *E. coli* removal (92.1%)
321 despite being far superior to that of the sand column (35%). Bacterial removal capacity
322 appears to correlate with the surface area of biochar (Table 1) with linear correlation
323 coefficient of 0.92. The porosity of biochars also plays a role in bacteria attachment. Despite
324 its low surface area (2.63 m² g⁻¹), the original micropores within biochar were transformed
325 into mesopores (4.85 nm) by amino-modification, which were more accessible and suitable
326 for bacteria attachment. As a result, the retention of bacteria was still reasonably high
327 although the attached bacteria in large pores were prone to remobilization as revealed in
328 Figure 4.

329 In addition, surface hydrophobicity has been regarded as an important factor in bacterial
330 adhesion because there is an increasing bacteria deposition on more hydrophobic surfaces
331 (Faille et al., 2002; Kingshott et al., 2003; Rivera-Utrilla et al., 2001). The surface acidity of
332 biochar was increased by all chemical modifications (Table 1), while in particular the O-
333 containing functional groups were largely introduced to the biochar surface via amino-
334 modification as revealed by XPS analysis (Table 2). This implies that the surface of AB
335 became more hydrophilic due to a significant increase in density of polar groups, which
336 accounted for the observation that AB was less favourable for removing hydrophobic bacteria

337 compared to other modified biochars.

338 Nevertheless, various bacterial strains such as *E. faecalis* (gram-positive) and *E. coli*
339 (gram-negative) have been reported to display a varying extent of bacterial attachment (Faille
340 et al., 2002; van Loosdrecht et al., 1987) and different retention mechanisms as well as
341 transport behaviour in saturated and unsaturated porous media (Chen and Walker, 2012;
342 Hijnen et al., 2005; Mohanty et al., 2013). Moreover, the stormwater runoff quality and
343 infiltration-drainage flow patterns (i.e., cycle and duration) significantly vary depending on
344 climate, season, catchment area, and land use. Further investigation of engineered
345 bioretention systems with modified biochars at a pilot/field scale is required for verifying
346 their long-term performance and service life taking into account bacterial growth, biochar
347 aging, and co-existing inorganic/organic contaminants using real stormwater runoff.

348

349 **4. Conclusions**

350 In this paper we have shown that in bioretention systems using biochar filter media,
351 chemical modifications using H_2SO_4 , H_3PO_4 , KOH, and amino group grafting changed the
352 physical and chemical properties of the biochars, which influenced the bacterial removal
353 from synthetic stormwater and subsequent remobilization due to intermittent flow. All
354 biochars regardless of chemical modifications demonstrated excellent performance as filter
355 media in the bioretention system, providing a high capacity for bacterial removal while
356 alleviating the extent of remobilization under intermittent flow. The H_2SO_4 -modification
357 improved *E. coli* retention and minimized subsequent remobilization by provision of a large
358 surface area, whereas H_3PO_4 - and KOH-modifications had marginal effects. In contrast,
359 amino-modification caused a drastic change in the physiochemical properties and resulted in
360 less effective performance. The surface area, porosity, and surface hydrophobicity of the
361 biochars were suggested to play a significant role in controlling the fate and transport of *E.*

362 *coli*. Pilot- or field-scale investigations are needed to evaluate the long-term performance of
363 engineered bioretention systems under various flow regimes using real stormwater runoff.

364

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371

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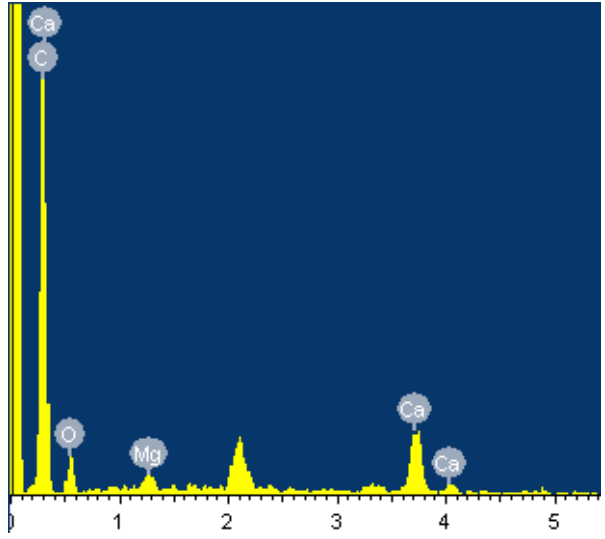
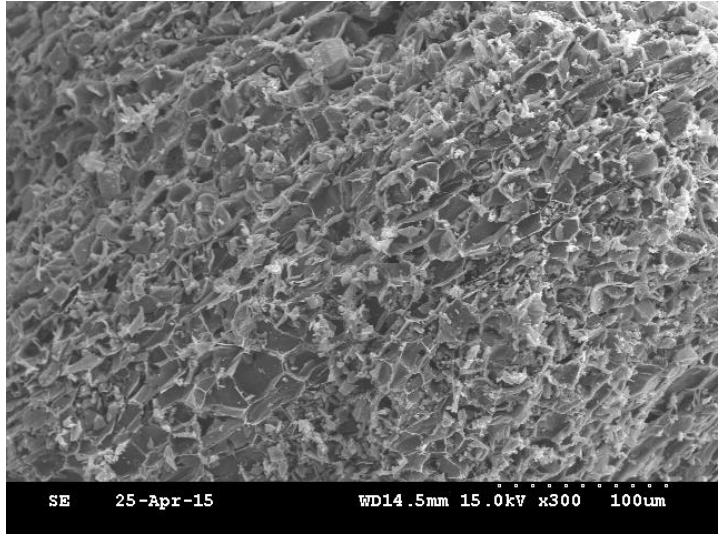
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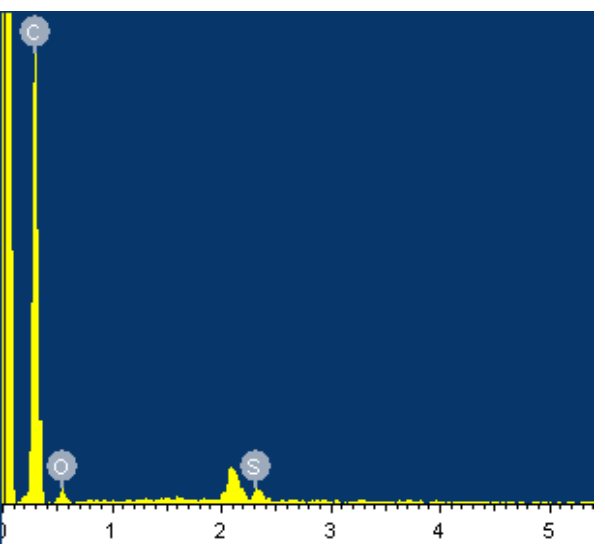
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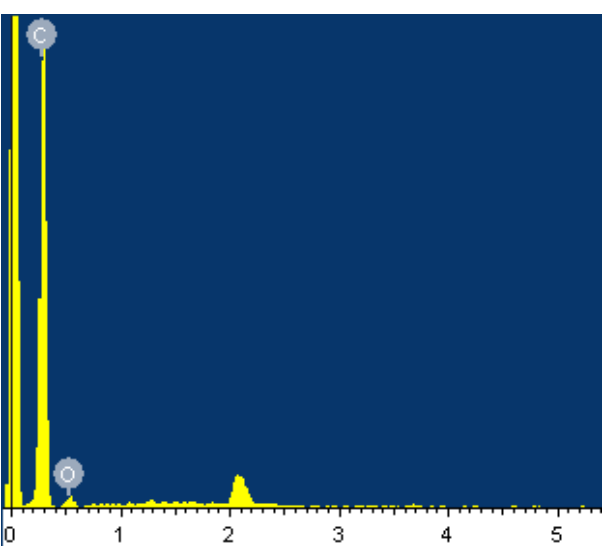
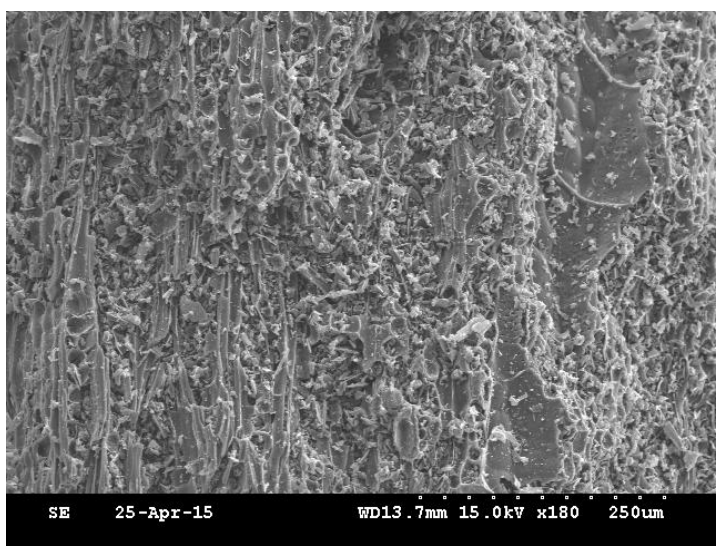
(a)



(b)



(c)



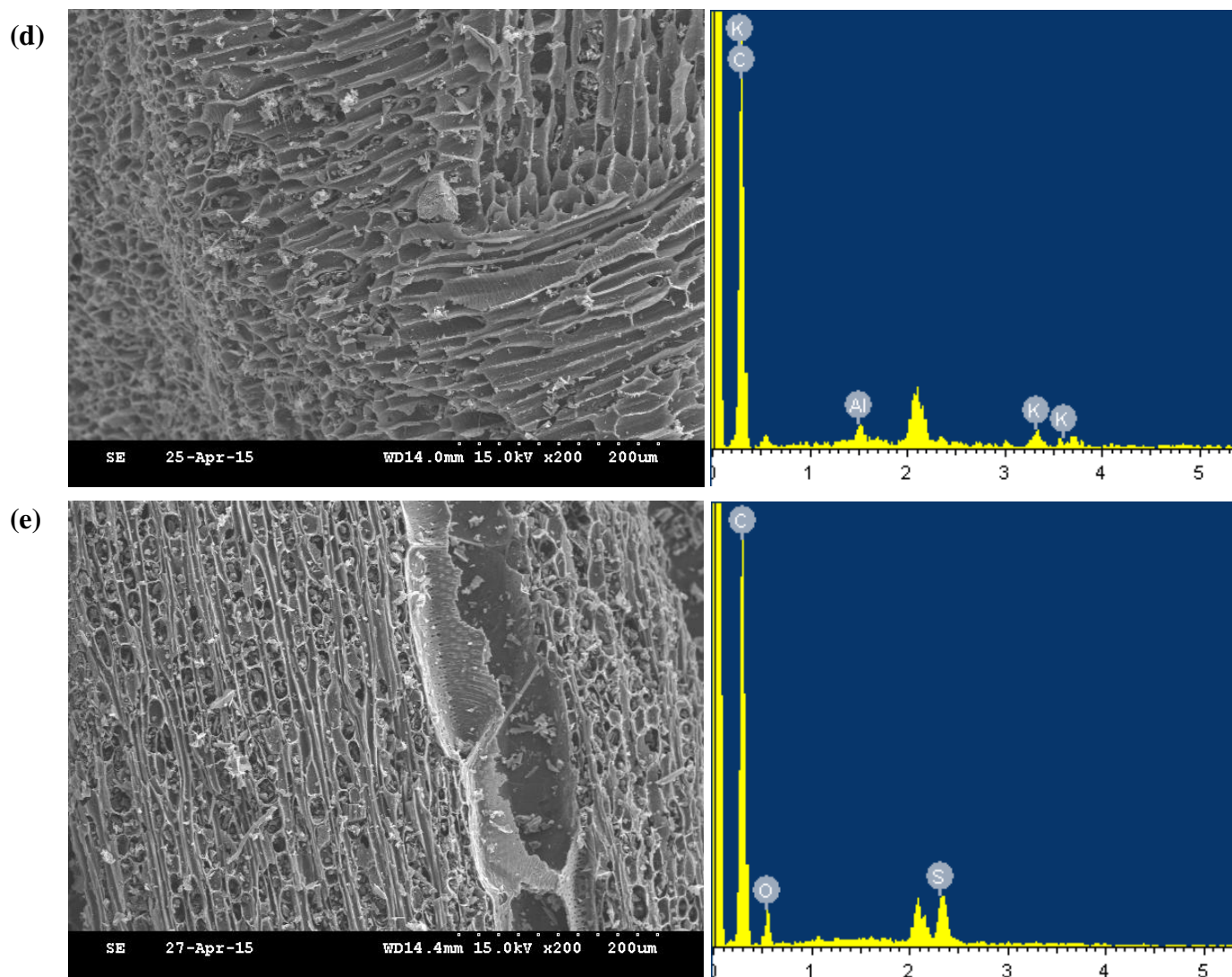


Figure 1. SEM images and corresponding EDS spectra of: (a) BC, (b) SB, (c) PB, (d) KB, and (e) AB (BC: original biochar, SB: H_2SO_4 -modified biochar, PB: H_3PO_4 -modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar).

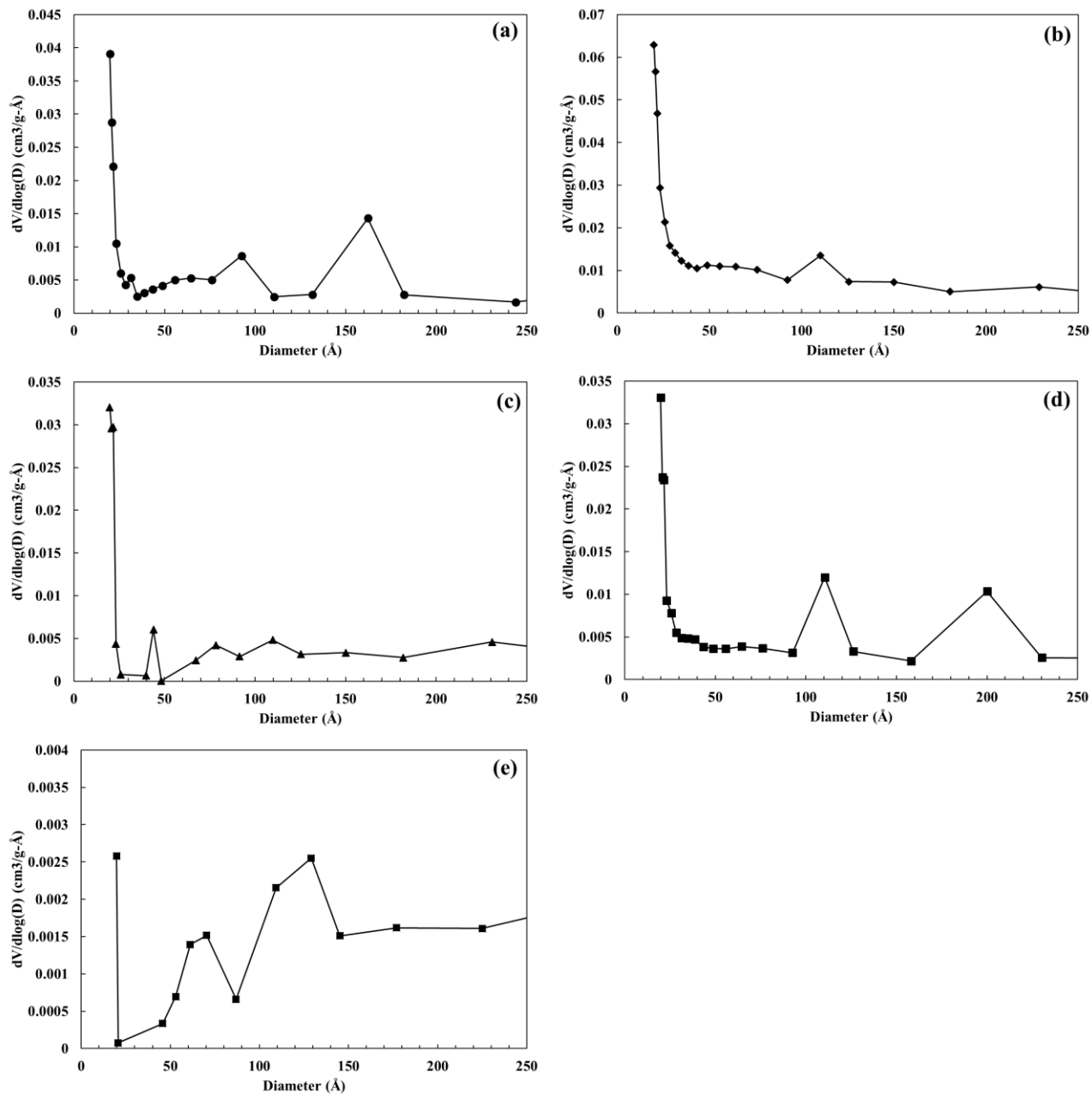


Figure 2. Pore size distribution of: (a) BC, (b) SB, (c) PB, (d) KB, and (e) AB (BC: original biochar, SB: H₂SO₄-modified biochar, PB: H₃PO₄-modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar).

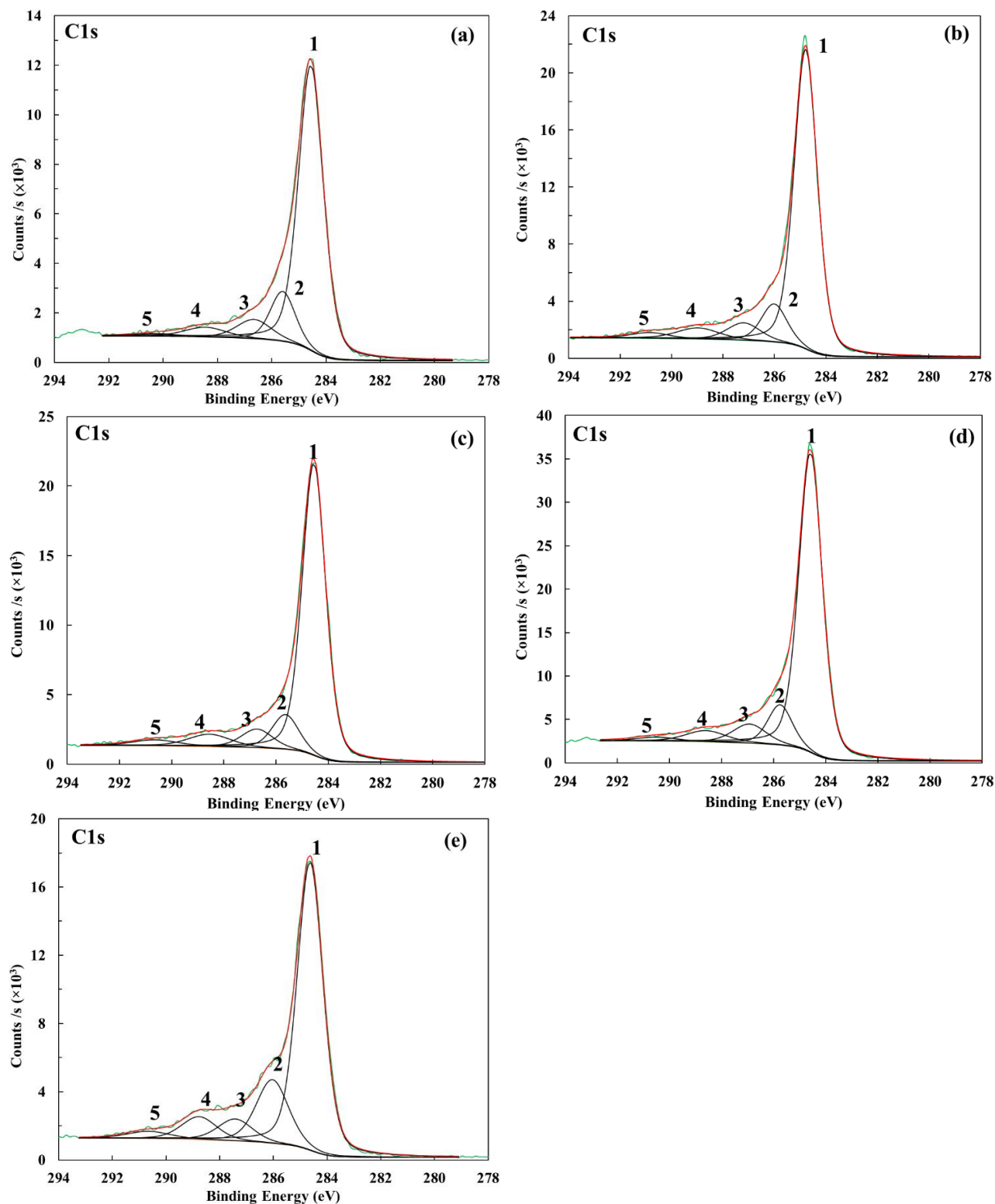


Figure 3. High-resolution XPS C1s spectra of: (a) BC, (b) SB, (c) PB, (d) KB, and (e) AB (Peak 1: C=C or C–C, Peak 2: C–O, C=N or CNH₂; Peak 3: C=O; Peak 4: O=C–O; and Peak 5: π - π^* transition; BC: original biochar, SB: H₂SO₄-modified biochar, PB: H₃PO₄-modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar).

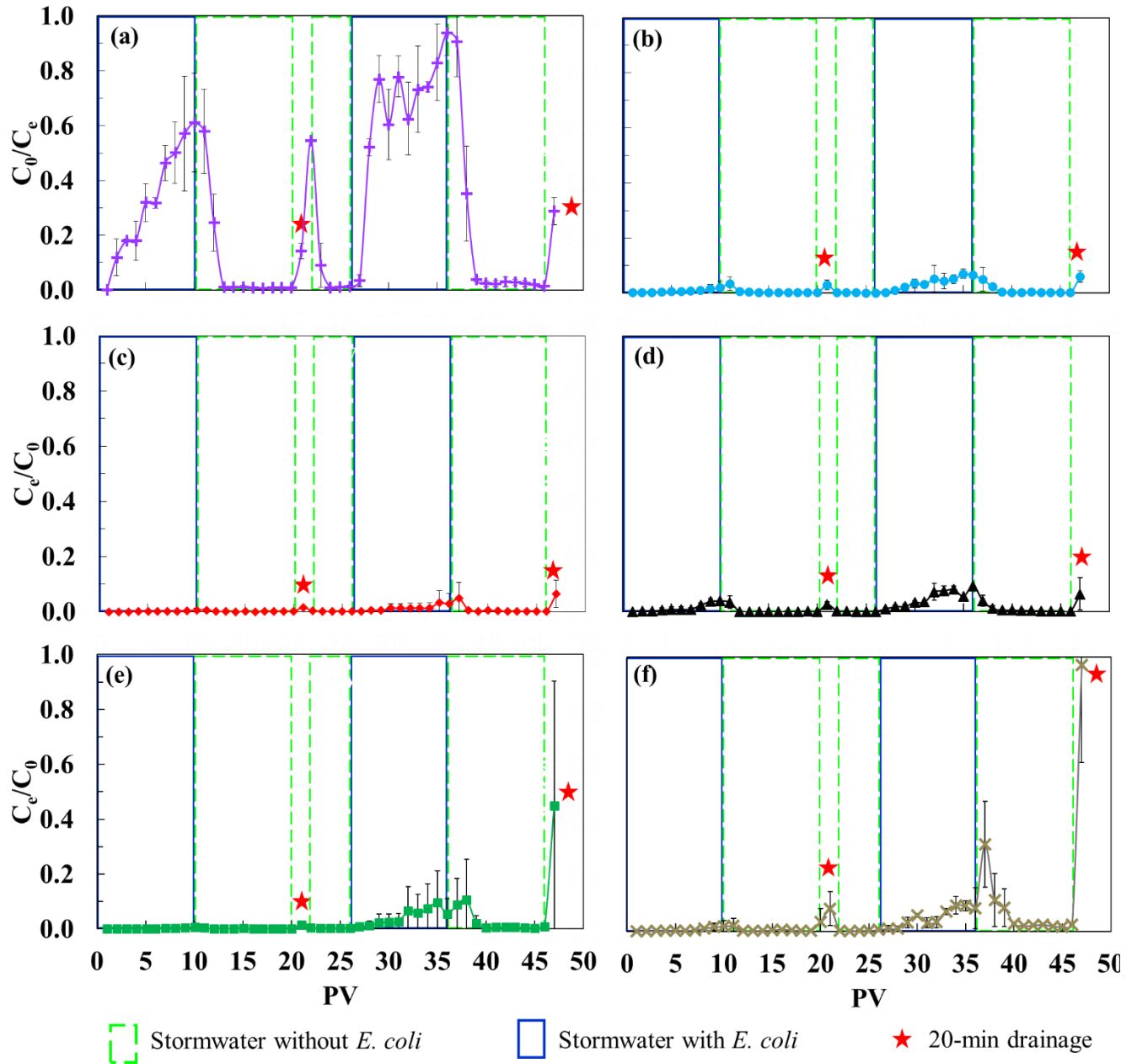


Figure 4. Breakthrough curves for *E. coli* in bioretention columns containing: (a) IOCS, (b) BC, (c) SB, (d) PB, (e) KB, and (f) AB (blue solid lines: injection of stormwater with *E. coli* (1-10 PV and 27-36 PV); green dotted lines: injection of stormwater without *E. coli* (11-20 PV, 22-26 PV, and 37-46 PV); red stars: 20-min gravitational drainage after infiltration (21 PV and 47 PV); biochar was blended with sand at 5% by weight; IOCS: iron oxide-coated sand; BC: original biochar, SB: H₂SO₄-modified biochar, PB: H₃PO₄-modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar).

Table 1. Physicochemical characteristics of original and modified biochars.

Physical Properties	BC	SB	PB	KB	AB
BET surface area, S_{BET} ($\text{m}^2 \text{g}^{-1}$)	137.0	230.6	160.9	113.8	2.63
Micropore surface area, S_{micro} ($\text{m}^2 \text{g}^{-1}$)	121.9	198.9	145.9	99.8	1.69
External surface area, S_{ext} ($\text{m}^2 \text{g}^{-1}$)	15.1	31.6	14.9	14.0	0.94
Total pore volume, V_{total} ($\text{m}^3 \text{g}^{-1}$)	0.0622	0.1052	0.0733	0.0557	0.0032
Mircopore volume, V_{micro} ($\text{m}^3 \text{g}^{-1}$)	0.0510	0.0827	0.0633	0.0450	0.0007
$V_{\text{micro}}/V_{\text{total}}$ (%)	82.0	78.6	86.4	80.7	23.4
Average pore diameter, D_p (nm)	1.82	1.82	1.82	1.96	4.85
Chemical Characteristics	BC	SB	PB	KB	AB
Basicity (mmol g^{-1})	1.015	0.048	0.905	0.897	0.069
Acidity (mmol g^{-1})	0.456	0.703	2.359	0.830	1.474
Carboxylic groups (mmol g^{-1})	0.116	0.240	1.646	0.313	0.606
Lactonic groups (mmol g^{-1})	N.D.	N.D.	N.D.	N.D.	N.D.
Phenolic groups (mmol g^{-1})	0.340	0.463	0.713	0.517	0.868

N.D.: not detectable; BC: original biochar, SB: H_2SO_4 -modified biochar, PB: H_3PO_4 -modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar.

Table 2. Distribution of surface functional groups (%) of original and modified biochars.

Biochars	C=C / C–C	C–O	C=O	O=C–O	π-π^* transition
BC	74.9	13.0	6.9	4.2	0.9
SB	75.7	10.6	6.4	5.0	2.4
PB	75.0	10.0	6.3	5.7	2.9
KB	76.1	10.6	6.8	4.7	1.8
AB	65.6	18.1	6.7	6.9	2.7

BC: pristine biochar, SB: H₂SO₄-modified biochar, PB: H₃PO₄-modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar.

Table 3. *E. coli* removal and remobilization in bioretention columns containing different biochars (5% w/w) during the entire flow regime (i.e., two infiltration cycles and two gravitational drainages with intermittent flow).

Column	<i>E. coli</i> removal (%)			<i>E. coli</i> remobilization (%)		
	1 st Infiltration Cycle ^a	2 nd Infiltration Cycle ^a	Overall ^b	1 st Drainage ^c	2 nd Drainage ^c	Intermittent Flow ^d
IOCS	54.6	29.3	35.0	1.30	7.06	12.09
BC	98.9	96.8	96.6	0.12	0.24	0.04
SB	99.8	97.9	98.7	0.05	0.28	0.04
PB	98.2	94.1	96.0	0.11	0.29	0.09
KB	99.7	92.8	96.4	0.04	1.43	0.11
AB	98.6	87.9	92.1	0.33	4.44	0.11

^a Percentage of total *E. coli* attached in the infiltration cycles (i.e., 1-20 PV and 22-46 PV before drainage by gravity);

^b Percentage of total *E. coli* attached (i.e., 1-47 PV);

^c Percentage of total *E. coli* detached during gravitational drainages (i.e., 21 PV and 47 PV);

^d Percentage of total *E. coli* detached during intermittent flow (i.e., 22-26 PV).

IOCS: iron oxide-coated sand; BC: original biochar, SB: H₂SO₄-modified biochar, PB: H₃PO₄-modified biochar, KB: KOH-modified biochar, and AB: amino-modified biochar.

Supplementary Material

[Click here to download Supplementary Material: CHEM_BC_SI_DT.DOCX](#)