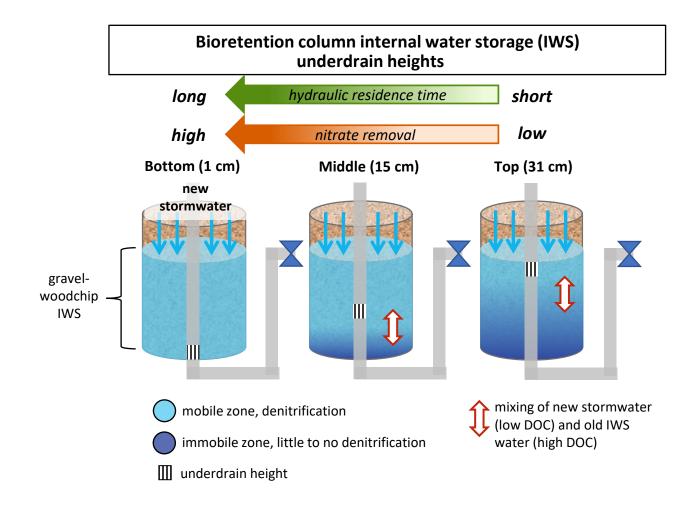
# Highlights

- Nitrate removal was positively linearly related to hydraulic residence time
- Raised underdrains created immobile zones but enhanced mixing during flow events
- Dual isotopes in nitrate distinguished dentification for mobile zones for all columns
- The bottom underdrain performed best in nitrogen removal for all tested conditions
- Multiple decision criteria such as nitrate and DOC may influence underdrain height



 The impact of bioretention column internal water storage underdrain height on denitrification under continuous and transient flow
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#### 7 Abstract

Internal water storage (IWS), a below-grade saturated layer, is a bioretention design 8 component created by adjusting the underdrain outlet elevation. Anaerobic conditions and the 9 presence of a carbon source in IWS facilitates denitrification. Yet it remains unclear how 10 underdrain height within the IWS impacts nitrate (NO<sub>3</sub><sup>-</sup>) removal. This study applied synthetic 11 stormwater with  $NO_3^{-1}$  to three laboratory columns with underdrains located at the bottom, 12 13 middle, or top of a 32 cm thick gravel-woodchip IWS. Under steady state conditions, underdrain nitrogen removal demonstrated a positive linear relationship with increasing hydraulic residence 14 time (HRT). For a 1 cm/h hydraulic loading rate (HLR), nitrogen removal efficiency increased 15 from 52 to 99% as underdrain height moved from the top to the bottom. Despite identical IWS 16 thickness across columns, immobilize zones below the middle and top underdrains limited the 17 steady state nitrogen removal. Dual isotopes in NO<sub>3</sub><sup>-</sup> also indicated denitrification occurred in 18 19 mobile zones and showed little or no denitrification in immobile zones due to limited mass transport. Transient flow conditions were applied, to mimic storms, followed by dry conditions. 20 Lower effluent nitrogen concentrations and mass fluxes were observed from the bottom 21 underdrain across the range of HLRs tested (1 to 5 cm/h) but performance of all three 22 underdrains converged after the application of one pore volume. The top underdrain enhanced 23 mixing between new incoming low-DOC stormwater and old IWS water with high-DOC which 24 minimized effluent DOC concentrations. NO<sub>3</sub><sup>-</sup> isotope enrichment factors indicated 25

denitrification during transient flow for all three underdrain heights and enrichment increased for
the 5 cm/h HLR. For sites with narrow IWS geometries (width to depth ratio < 1), optimal</li>
underdrain height is likely located between the bottom and top of the IWS to promote mixing
with old IWS water high in DOC and sustain denitrification during storms.

#### 30 Keywords:

internal water storage design, nitrogen management, dual nitrate isotopes, urban stormwater
 quality, DOC, immobile zones

#### 33 **1. Introduction**

Urban runoff is considered a major pollutant source to receiving waters. Nutrients, such 34 35 as nitrogen, conveyed in runoff cause habitat degradation and algal blooms which are expected to worsen with population growth and climate change (Whitehead et al., 2009). Green 36 37 stormwater infrastructure (GSI) is implemented in urban landscapes to protect water resources. 38 Bioretention is a passive GSI strategy that employs multiple functions (ponding, infiltration, 39 biotic processes, and water storage) to manage runoff quantity and water quality. The main design components include a vegetated basin filled with engineered media. An underdrain is 40 41 often incorporated in a gravel layer below engineered fill media to collect a portion of infiltrated 42 stormwater and discharge to the sewer network or receiving waterbody.

Internal water storage (IWS) is a subsurface bioretention design component created by raising the outlet elevation of the underdrain. For combined sewer systems, IWS provides additional storage volume and water is primarily released via exfiltration into native media. For separate sewer systems, sites with less permeable soils, or nutrient sensitive watersheds, IWS can be implemented for water quality improvements (Brown et al., 2009). Nitrate (NO<sub>3</sub><sup>-</sup>) removal in bioretention occurs via plant uptake or biotic processes including denitrification or dissimilatory NO<sub>3</sub><sup>-</sup> reduction to ammonia (DNRA) (Bu et al., 2017; Igielski et al., 2019; Li et al., 2019). When the IWS remains saturated and a carbon source is available (often leached from woodchips), IWS provides favorable conditions for denitrification and  $NO_3^-$  is reduced to nitrogen gas (N<sub>2</sub>)(Kim et al., 2003). IWS design often connects the perforated underdrain, located at the base of the gravel layer, to an upturned elbow. Alternatively, a raised underdrain can be positioned at the top of the IWS to achieve the same thickness and storage capacity (Donaghue et al., 2022). However, the impact of IWS underdrain configuration on  $NO_3^-$  removal needs to be evaluated.

56 Understanding the impact of IWS design choices on water quality, specifically NO<sub>3</sub>, advances design and informs practitioners. Increased hydraulic residence time (HRT) 57 corresponds to increased NO<sub>3</sub><sup>-</sup> removal (Halaburka et al., 2017; Igielski et al., 2019). For 58 59 example, one study demonstrated that HRT accounted for 93% of NO<sub>3</sub><sup>-</sup> removal compared to the variables of dissolved oxygen (DO), temperature, and influent NO<sub>3</sub><sup>-</sup> concentration (Martin et al., 60 2019). We previously employed bioretention columns and modeling to demonstrate that raised 61 underdrain heights, with respect to the bottom of the IWS, introduced nonideal flow regions, or 62 immobile zones. Raised underdrain heights reduced hydraulic efficiency and consequently the 63 measured HRT (Donaghue et al., 2022). It is expected that IWS underdrain height would 64 influence  $NO_3^-$  removal efficiency which served as a primary motivation to this study. In urban 65 environments, space limitations and property costs present challenges for GSI implementation. 66 67 Understanding the impact of IWS underdrain height on  $NO_3^-$  removal, particularly in narrow systems, can allow design flexibility without compromising water quality goals. 68

Because IWS underdrain height induces different flow patterns, the consideration of how IWS underdrain height impacts  $NO_3^-$  dynamics as a function of rain intensity and dry periods is critical. Under intense precipitation, faster infiltration rates into the IWS can shorten HRTs and consequently reduce  $NO_3^-$  removal. Optimizing IWS underdrain configuration to site specific

73	characteristics could combat these effects and maximize NO3 <sup>-</sup> removal during precipitation.
74	During antecedent dry periods (ADP), woodchips leach dissolved organic carbon (DOC) into
75	IWS porewater and DOC concentrations can increase as ADP increases (Lynn et al., 2015a).
76	However, during prolonged ADPs evapotranspiration and exfiltration to underlying media can
77	expose woodchips at the top of the IWS to unsaturated conditions. Others have shown that
78	woodchips in unsaturated layers degrade faster than saturated woodchips and can export higher
79	DOC and organic nitrogen (Lynn et al., 2015a). The selection of an appropriate IWS underdrain
80	configuration may require balancing multiple water quality parameters such as NO <sub>3</sub> <sup>-</sup> and DOC.
81	Dual isotopes in $NO_3^-$ is a tool gaining traction to characterize nitrogen processing in
82	stormwater (Burgis et al., 2020; Burns et al., 2009; Carey et al., 2013; Yang and Toor, 2016).
83	Dual isotopes refer to the analysis of both the nitrogen isotopes ( $^{14}N$ and $^{15}N$ ) and the oxygen
84	isotopes ( <sup>16</sup> O and <sup>18</sup> O) in NO <sub>3</sub> <sup>-</sup> . Isotopes can be useful for identifying transformation processes
85	when the process preferentially favors an isotope, leading to fractionation. For example, a kinetic
86	isotope effect is created during microbial denitrification, as organisms preferentially consume
87	lighter nitrogen and oxygen isotopes ( <sup>14</sup> N and <sup>16</sup> O); this depletion creates solute NO <sub>3</sub> <sup>-</sup> enriched in
88	heavier isotopes ( <sup>15</sup> N and <sup>18</sup> O)(Mariotti et al., 1981; Zhang et al., 2019). Consequently,
89	denitrification is marked by a predominantly linear, positive trend in both the $\delta^{15}$ N and $\delta^{18}$ O.
90	Batch experiments demonstrated microbial denitrification can cause isotopic fractionation within
91	tens of minutes to several hours (Currie, 2007; Kim et al., 2003; Sebilo et al., 2019). However,
92	isotope patterns in flow-through systems such as IWS are not well-studied. Here, column
93	experiments coupled with dual isotope analysis contribute to understanding the application of
94	nitrogen isotopes in GSI systems.

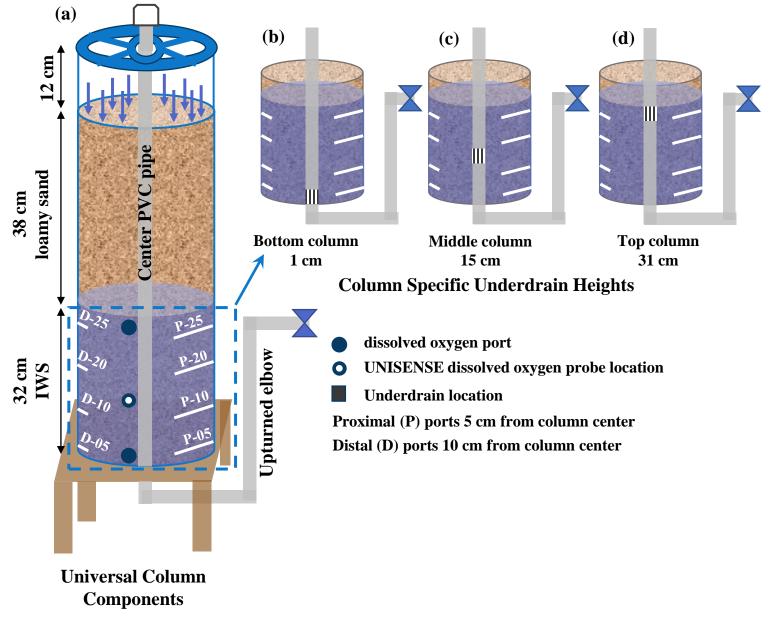
This work employs three laboratory bioretention columns comprised of a gravelwoodchip IWS with varying underdrain height to distinguish microbial denitrification from dilution under steady state and transient flow. Steady state conditions considered the effect of HRT on  $NO_3^-$  removal efficiency and  $NO_3^-$  removal kinetics. Transient conditions evaluated the effect of hydraulic loading rate (HLR) and ADP on IWS water quality,  $NO_x$  dynamics, and potential denitrification during flow events.

#### 101 **2. Materials and methods**

## 102 2.1. Bioretention column design

IWS underdrain height varied across three cylindrical bioretention columns (28.8 cm ID 103  $\times$  82 cm height) (Fig. 1a) by adjusting the elevation of 2 cm thick screened openings on the 104 center PVC pipe as follows: 0 to 2 cm bottom column (1 cm, Fig. 1b), 14 to 16 cm middle 105 106 column (15 cm, Fig 1c), and 30 to 32 cm top column (31 cm, Fig. 1d). IWS media included a blend of pea-gravel and hardwood woodchips at a ratio of 2:1 by volume; the mixture and ratio 107 were selected based on performance reported by others (Lynn et al. 2015b). Further details 108 regarding column media are provided in the SI and our previous work (Donaghue et al., 2022). 109 110 The center PVC pipe connected to an upturned elbow outside each column. The invert elevation 111 of the outlet was 30 cm above the column base to maintain a constant IWS thickness across all columns. The IWS included two sample port groups located 5 cm (proximal, P) and 10 cm 112 113 (distal, D) from the center PVC pipe, respectively. The sample port heights were 5, 10, 20, and 25 cm above the column base (Fig. 1a). Sample identification notes the sample group followed 114 by sample height. For example, P-20 refers to the proximal IWS sample port 20 cm above the 115 column base. Sampling also included the underdrain effluent. 116





Universal column schematic (a) and underdrain configurations for the bottom (1 cm) (b), middle (15 cm) (c), and top (31 cm) (d) underdrain heights. The IWS was comprised of pea gravel and hardwood woodchip at a 2:1 ratio by volume.

#### 117 2.2. Key nomenclature

Bioretention columns were differentiated by the height of the underdrain using the terms: 118 119 bottom column (1 cm), middle column (15 cm), and top column (31 cm). When referring to the underdrain sample location we used the terms bottom, middle, or top underdrain. Our previous 120 study (Donaghue et al., 2022) employed tracer studies and USGS VS2DRTI (USGS, 2019) 121 modeling to characterize IWS hydraulics. Results demonstrated the presence of mobile zones 122 123 (areas of flowing water) generally above the underdrain and immobile zones (low flow or stagnant areas) below the middle and top underdrain. To account for the presence of immobile 124 zones, measured HRT was calculated by multiplying the volume of column media by the 125 effective pore volume (PV; which considers only the mobile region) divided by flow rate 126 127 (Equation S1).

The experimental design included steady state ("SS"; continuous flow) and transient 128 ("Trans"; intermittent flow) events. Replicate transient events were conducted for each condition 129 and are indicated using capitol roman numerals. Flow conditions were conducted at HLRs of 1, 130 131 2.5, and 5 cm/h, which was also included in the event name. Transient events considered three different ADPs (2.8, 6.8, and 13.8 days) defined here as the dry time between the end of the 132 transient event (x) and the start of event (x+1). For reporting purposes, nominal ADPs are used 133 (i.e., 3, 7, and 14 days). The term "old" IWS water describes water stored in the IWS between 134 transient events and "new" water refers to fresh incoming synthetic stormwater applied to the top 135 of the column (Wang et al., 2018). The final event concentration refers to the final sample 136 collected at t=300 minutes during transient events. While  $NO_3^{-1}$  was the only nitrogen source 137 added to synthetic stormwater, column samples were analyzed for total nitrogen (TN), total 138 139 dissolved nitrogen (TDN), ammonium/ammonia ( $NH_4^+/NH_3$ ), and  $NO_x$  (the sum of  $NO_3^-$  plus

nitrite (NO<sub>2</sub><sup>-</sup>)). Nitrite comprised less than 5% of NO<sub>x</sub> (monitored during events SS-5 and SS-2.5); therefore, analysis was limited to NO<sub>x</sub> for events following and was assumed to be predominantly NO<sub>3</sub><sup>-</sup>. NO<sub>x</sub> and DOC mass loads released from the underdrain during flow were used to assess column performance. Mass loads were determined by integrating the area under the underdrain concentration curve using the trapezoidal method. Mass flux (mg/m<sup>2</sup> for a given transient even) equals the total mass load released from the underdrain during flow divided by the column horizontal cross-sectional area (0.064 m<sup>2</sup>).

147 2.3. Synthetic stormwater preparation and application

Synthetic stormwater was prepared using deionized water or reverse osmosis water in a 148 246 L tank.  $NO_{3}$ , in the form of sodium nitrate, was added at a nominal concentration of 3 mg-149 N/L which agreed with other column studies (Igielski et al., 2019; Kim et al., 2003; Peterson et 150 al., 2015) and mimics NO<sub>3</sub><sup>-</sup> porewater concentrations observed for monitored field sites in 151 Philadelphia, PA. Synthetic stormwater also included: orthophosphate (0.1 mg-P/L) to support 152 microbial growth, sodium chloride (58.4 mg/L) for ionic strength, and sodium bicarbonate (252 153 154 mg/L) for buffering capacity (Table S1). The pH was adjusted to ~7.0 using hydrochloric acid. Synthetic stormwater was applied to the top of columns using a Masterflex L/S digital drive 155 peristatic pump (Cole-Parmer) and evenly distributed through a polyethylene ring with 156 equidistant perforations. 157

158 2.4. Water quality analysis

For steady state water quality parameters measured included pH, DOC, NH4<sup>+</sup>/NH3, NO<sub>x</sub>,
DON, PON and TN from the underdrain and NO<sub>x</sub> from IWS sample ports (Table S3). DO was
measured in the IWS using a UNISENSE Oxygen MiniOptode 3000 μm (UniSense, Denmark).
UNISENSE probes were located at 15 cm above the column base. Underdrain flow rates were

163	measured gravimetrically by collecting underdrain effluent for one minute in a beaker. The mass
164	was then measured and converted to mL/min. DOC and pH were measured for the underdrain
165	location only. For steady state, DOC was determined by catalyzed combustion using a TOC-V
166	CHS Analyzer (Shimadzu). DOC samples from SS-1HLR exceeded holding times following
167	COVID lab restrictions and were not analyzed. For transient events, UV absorbance (254 nm)
168	was measured using an Agilent 8453 spectrophotometer and was employed as a surrogate for
169	DOC (e.g., similar to Abusallout and Hua, 2017; Berger et al., 2019). Samples were analyzed the
170	same day of collection. pH was measured using a Thermo Scientific Orion Versa Star module.
171	Nitrogen chemistry analysis included TN, TDN, NO <sub>x</sub> , and $NH_4^+/NH_3$ using an AQ300
172	Discrete Analyzer (SEAL Analytical). Samples for dissolved constituents were centrifuged at
173	1,000 x g for 8 min to remove particulates and bacteria. $NO_x$ and $NH_4^+/NH_3$ were analyzed in
174	accordance with EPA methods 126-D Rev. 0 and 150-A Rev. 2, respectively. TN (uncentrifuged)
175	and TDN determination used peroxodisulfate oxidation digestion (Ebina et al., 1983) followed
176	by NO <sub>x</sub> analysis described above. Particulate organic nitrogen (PON=TN-TDN) and dissolved
177	organic nitrogen (DON=TDN-NO <sub>x</sub> -NH <sub>4</sub> <sup>+</sup> /NH <sub>3</sub> ) were determined by difference. AQ300 batch
178	analysis included continued calibration verification (CCV), continued calibration blank (CCB),
179	and reference material (Hach 2833249) quality control samples analyzed every 10 samples. For
180	digested TN and TDN samples, an ammonium reference material (2.5 mg-N/L) was included
181	with each batch as a quality control measure for digestion recovery (conversion of $NH_4^+$ to $NO_3^-$
182	). Acceptance criteria for quality control samples and the digested reference material sample was
183	$\pm 10\%$ of the known concentration. Error propagation for DON concentrations determined by
184	difference was calculated using the standard deviation of replicates for $NO_x$ and $NH_4^+/NH_3$
185	chemistries reported in method precision studies. When considering the 2.5 mg-N/L digested

reference material, this corresponded to an uncertainty less than 5%. Sample preservation andanalytical detection limits are reported in Table S6.

#### 188 2.5. Isotopic analysis and enrichment factor calculations

189 Stable isotope samples for  $NO_3^{-}$  were collected at the end of each steady state event from the underdrain location and sample ports D-10 and D-25 (Table S3) and during transient events 190 191 (Table S4). Isotope samples were filtered (0.45-µm) and stored frozen in 30-mL wide-mouth high-density polyethylene (HDPE) bottles (Thermo Scientific<sup>TM</sup>, DWK Life Sciences 192 Wheaton<sup>™</sup> Leak-Resistant). Isotope analysis was conducted at the Davis Stable Isotope Facility 193 (SIF), University of California. Samples selected for <sup>15</sup>N and <sup>18</sup>O analysis had NO<sub>x</sub> 194 measurements above SIF lower limit of quantitation (0.4 µM or ~0.05 mg-N/L) and methods 195 followed a bacteria denitrification assay (University of California Davis Stable Isotope Facility, 196 2021). Nitrogen (N) and oxygen (O) content in column samples were compared to laboratory 197 reference materials with known <sup>15</sup>N and <sup>18</sup>O. Analytical results were presented in delta notation 198  $(\delta)$ , expressed as parts per mil (‰), based on the following formulas: 199  $\delta^{15}N = [({}^{15}N/{}^{14}N)_{\text{sample}}/({}^{15}N/{}^{14}N)_{\text{reference material } x \ 1000]$ (1)200  $\delta^{18}O = [({}^{18}O/{}^{16}O)_{\text{sample}}/({}^{18}O/{}^{16}O)_{\text{reference material }} \times 1000]$ (2)201 The presence of denitrification is suggested when decreasing NO<sub>x</sub> concentrations 202 coincided with increasing  $\delta^{15}$ N-NO<sub>3</sub><sup>-</sup> and  $\delta^{18}$ O-NO<sub>3</sub><sup>-</sup> along a linear slope between 0.5 and 1.0 203 (Kendall et al., 2007). When isotopic signatures suggested denitrification, enrichment factors ( $\varepsilon$ ) 204

provided an estimation of column denitrification efficiency. Enrichment factors were calculated
using the isotopic ratios in equations 3 and 4:

207 
$$\varepsilon_{15N} = \left(\delta \ 15N_{sample} - \delta \ 15N_{initial}\right) / \ln(NO_{3\ sample}^{-}/NO_{3\ initial}^{-})$$
(3)

208 
$$\varepsilon_{180} = \left(\delta \ 180_{sample} - \delta \ 180_{initial}\right) / \ln(NO_{3\ sample}^{-}/NO_{3\ initial}^{-})$$
(4)

where difference between sampled and initial isotope values are compared to the fraction of  $NO_3^{-1}$ 209 concentration remaining. The enrichment factor is the slope of the linear trend between the 210 isotope difference and concentrations on a log normal scale and more negative  $\varepsilon$  indicates more 211 efficient microbial denitrification. Enrichment factors were determined for <sup>15</sup>N-NO<sub>3</sub><sup>-</sup> and <sup>18</sup>O-212  $NO_3^-$  for select steady state and transient events. It was assumed  $NO_x$  equaled  $NO_3^-$  for 213 214 enrichment factor calculations.

2.6. *Steady state events* 

Steady state (SS) considered the three events SS-5HLR, SS-2.5HLR, and SS-1HLR 216 (Table 1; additional detail in Table S2) which corresponded to HLRs of 5, 2.5, and 1 cm/h, 217 218 respectively. Before initiating SS, tracer studies described elsewhere occurred under continuous flow from November 2019 to January 2020; approximately 32 total PVs were applied to each 219 column during this time (Donaghue et al., 2022). The IWS remained fully saturated during SS-5 220 221 through SS-1 (February 2020 to March 2020). For each event, flow application remained constant until the relative standard deviation of NO<sub>x</sub> concentrations varied less than 30% for 222 three consecutive measurements at the underdrain and mobile zone IWS sample ports. This 223 generally occurred within 5 days. The average influent synthetic stormwater  $NO_3^-$  concentration 224 for steady state was  $2.90 \pm 0.26$  mg-N/L. Samples were generally collected daily Monday 225 226 through Friday and analyzed for parameters listed in Table S3.

227

215

The steady state NO<sub>x</sub> removal efficiency was determined at the underdrain location using 228 equation 5

229 
$$NO_{\chi}$$
 (%) =  $\left(\frac{C_{influent} - C_{underdrain}}{C_{influent}}\right) * 100$  (5)

Event	HLR	Bottom U. (0	cm)	Middle U.	(15 cm)	<b>Top U. (</b>	30 cm)	<b>ADP</b> <sup>d</sup>
	cm/h	<b>Flow</b> avg. mL/min	<b>HRT</b> Eff PV <sup>c</sup> h	<b>Flow</b> avg. mL/min	<b>HRT</b> Eff PV <sup>c</sup> h	<b>Flow</b> avg. mL/min	<b>HRT</b> Eff PV <sup>c</sup> h	days
SS-5HLR	5	50.2	4.7	53.0	3.7	51.9	2.8	
SS-2.5HLR	2.5	26.1	9.4	26.2	7.4	26.4	5.6	
SS-1HLR	1	10.7	21.9	11.2	17.4	11.4	13.2	
Dormant Period <sup>b</sup> ( SS-1.5HLR-post-d		20 - 8/10/2020) 13.8	17.6	13.6	13.9	14.0	10.5	
Trans-1HLR-I	1	11.8		11.0		11.3		6.8
Trans-1HLR-II	1	10.9		10.6		10.6		6.8
Trans-2.5HLR-I Trans-2.5HLR-II <sup>e</sup>	2.5 2.5	<i>Not sampled</i> 28.0		27.2		26.7		6.8 6.8
Trans-2.5HLR- III <sup>e</sup>	2.5	25.6		26.5		26.2		6.8
Trans-5HLR-I Trans-5HLR-II	5 5	<i>Not sampled</i> 54.3		55.1		55.3		6.8 6.8
Trans-5HLR-III	5	53.1		51.5		53.7		6.8
Trans-14ADP-I	2.5	25.3		25.9		24.9		13.8
Trans-3ADP-I	2.5	25.1		26.1		25.6		2.8
Trans-14ADP-II	2.5	26.6		25.9		26.1		13.8
Trans-3ADP-II	2.5	27.1		26.8		27.7		2.8

Table 1. Column event sequence.

A detailed version of this table in included in the Supplementary Data

<sup>a</sup> steady state (SS) flow refers to continuous flow conditions. Transient flow events were applied for a 5 h duration

<sup>b</sup> During COVID, lab access was restricted and columns experienced a dormant period from March 2020 to August 2020.

- <sup>c</sup> hydraulic residence time (HRT) was calculated based on effective pore volume (PV); in other words, the portion of pore volume that contributed to flow.
- <sup>d</sup> Antecedent dry period (ADP) equals the number of days between events; nominal ADP reported in the event name.

<sup>e</sup> Events Trans-2.5HLR-II and Trans-2.5HLR-III also correspond to Trans-7ADP scenarios.

where  $C_{influent}$  equals the synthetic stormwater NO<sub>x</sub> concentration (~3 mg-N/L) and  $C_{underdrain}$ equals the observed underdrain effluent NO<sub>x</sub> concentration. Significant differences across steady state events were determined using a paired t-test ( $\alpha$  of 0.05).

SS-1HLR finished on March 16, 2020 after 5 months of continuous operation. Due to 233 interruptions in lab access associated with COVID restrictions, the columns sat dormant for 4.5 234 months (March through August 2020) and a portion of the IWS became unsaturated during the 235 236 dormant period. Upon returning to the lab, a pulse tracer test was performed for all columns to establish a new baseline for hydraulics (see SI for details). SS-1.5-postdormant was introduced at 237 a HLR of ~1.5 cm/h to reacclimate denitrifying conditions before transitioning to transient flow 238 239 events. During SS-5HLR through SS-1.5-postdormant ~110 total PVs were applied to each column. 240

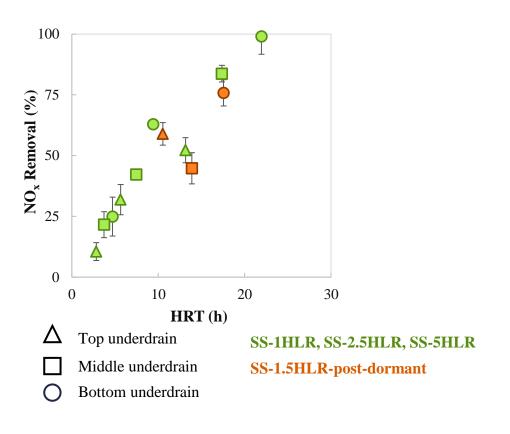
241 2.7. Transient events

Transient flow provided an environmentally relevant representation of episodic storm and 242 dry conditions. Transient events lasted five hours (300 min) and considered HLRs of 1, 2.5, and 243 5 cm/h and ADPs of 3, 7, and 14 days. Table 1 reports transient event sequencing; the event 244 245 identification notes either the HLR or ADP testing scenario and the event replicate (i.e., I, II, or III). For example, Trans-2.5HLR-II refers to transient flow at a 2.5 cm/h HLR, replicate two. For 246 ADP transient events, a HLR of 2.5 cm/h was applied. After event Trans-2.5HLR-I, different 247 initial IWS water levels were observed. Each IWS was upfilled using reverse osmosis water prior 248 to the start of the event to ensure IWS water level depths were consistent across columns (low 249 NO<sub>3</sub><sup>-</sup>~0.4 mg-N/L, and phosphorous, ~0.2 mg-P/L, concentrations). Reverse osmosis water was 250 applied through the center PVC pipe (filling the IWS from the screened opening upward) and 251 pumped at a flow rate of 20 mL/min. This approach was adopted for the remainder of transient 252 253 events.

Transient sampling followed the frequency listed in Table S4. Samples were collected 254 immediately before flow application (t = 0 min) and then at time points of 100, 140, 180, 220, 255 260, 300 min for the middle and top column and 120, 160, 200, 240, 280, 300 min for the bottom 256 column. Sample locations included the underdrain, D-25, and D-05. The D-25 and D-05 257 locations were chosen to collect samples from both mobile and immobile zones determined from 258 259 previous tracer studies (Donaghue et al., 2022). To account for potential transitional effects between events, sample collection was omitted for Trans-2.5HLR-I and Trans-5HLR-I. A final 260 pulse tracer test was performed at the end of transient events and confirmed flow patterns were 261 not altered (Table S5, Fig. S1). 262

## 263 **3. Results and discussion**

3.1. Steady state NO<sub>x</sub> removal, isotopes enrichment for mobile zones, and IWS non-ideal flow 264 265 NO<sub>x</sub> removal efficiency (equation 5) increased as underdrain height decreased for all steady state events (Fig. 2). As HLR decreased from 5 to 1 cm/h, effluent NO<sub>x</sub> removal increased 266 from 25 to 99% for the bottom underdrain, 22 to 84% for the middle underdrain, and 10 to 52% 267 for the top underdrain (Fig. 2, p-value < 0.05 for SS-2.5HLR and SS-5HLR). Superior 268 performance observed for the bottom underdrain is attributed to longer HRTs relative to the 269 middle and top underdrains heights (Table 1). For example, mean tracer residence times equaled 270 5.0 h, 3.8 h, and 3.5 h for the bottom, middle, and top column, respectively for an applied HLR 271 of 5 cm/h. Others demonstrated how longer HRT increases  $NO_3^-$  removal (Halaburka et al., 272 2017; He et al., 2018). Studies considering regression on DO, temperature, influent NO<sub>3</sub><sup>-</sup> 273 concentration, and HRT indicated HRT contributed most (93%) to NO<sub>3</sub><sup>-</sup> removal (Martin et al., 274 2019). 275

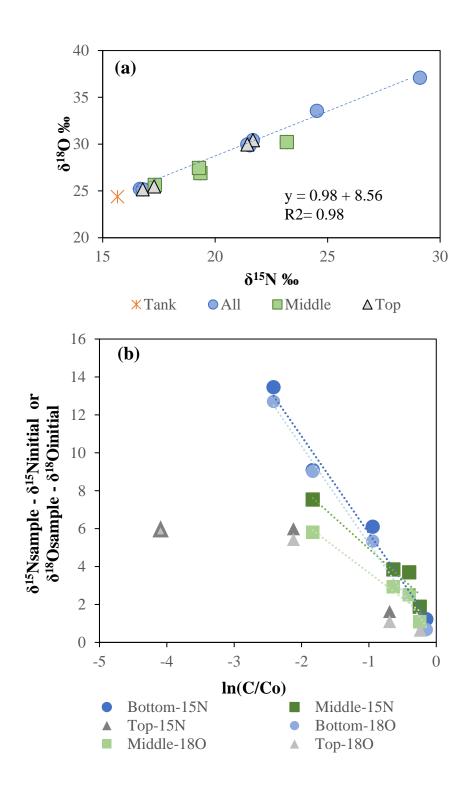


Percent  $NO_x$  removal observed at the underdrain as a function of hydraulic residence time (HRT). HRT was determined based on effective pore volume. r<sup>2</sup> values for events SS-1HLR, SS-2.5HLR, and SS-5 HLR equaled 0.9337.

276	The dual isotope data from SS-1HLR support the effectiveness of mobile zones in
277	denitrification. The $\delta^{15}$ N versus $\delta^{18}$ O plot shows a 1:1 line indicating denitrification (Fig. 3a)
278	with up to a 13‰ difference from the synthetic stormwater water. The middle and bottom
279	columns showed a linear slope on the enrichment plots for both isotopes, which confirmed that
280	denitrification was occurring (Fig. 3b). However, the top column showed a non-linear
281	enrichment response, which indicated mixing of denitrified water and immobile zone water
282	where $NO_3^-$ mass transfer was limited. The isotope enrichment calculation helped distinguish
283	between lower $NO_3^-$ concentration due to mixing with immobile zone water and denitrification
284	which removes NO <sub>3</sub> <sup>-</sup> . The enrichment factors of $-5.2$ and $-4.7$ for $\delta^{15}N$ versus $\delta^{18}O$ were close in
285	value (Table 2) with slightly lower expected for $\delta^{18}$ O. Isotope enrichment factors for middle and
286	bottom underdrains were also similar although slightly lower for middle underdrain (-4.6 and -
287	3.5 for $\delta^{15}$ N versus $\delta^{18}$ O). Isotope enrichment for SS-1HLR versus SS-1.5HLR-post-dormant
288	was also similar (-5.1 versus -5.4 for $\delta^{15}N$ and -4.5 versus -5.0 for $\delta^{18}O$ ) although the highest
289	fractionation was observed for a single sample in SS-1HLR from the bottom underdrain.
290	Water quality parameters of DO, DOC, and NH <sub>4</sub> <sup>+</sup> confirmed favorable conditions for
291	denitrification existed in the IWS for all columns. Denitrification conditions require DO less than
292	3 mg-O <sub>2</sub> /L (Gómez et al., 2002) and an adequate carbon source such as DOC leaching from
293	woodchips (Newcomer et al., 2012). Steady state IWS DO concentrations (measured at 15 cm
294	height) remained less than 0.2 mg-O <sub>2</sub> /L across all three columns (Fig. S2a-S2b). Average DOC
295	concentrations were 2.1 to 4.8 mg-C/L during SS-5HLR and decreased to non-detect levels (< 2
296	mg-C/L) during SS-2.5HLR. Decreasing DOC concentrations as HLR decreased is likely
297	associated with longer HRT for NO3 <sup>-</sup> removal and DOC utilization (Lynn et al., 2015a). During
298	steady state, effluent $NH_4^+$ concentrations ranged from non-detect (i.e., $\leq 0.016$ mg-N/L) to

Event	<sup>15</sup> N enrichment (ε)	<sup>18</sup> O enrichment (ε)	Number of points
All	-5.2	-4.7	8
SS-1HLR	-5.1	-4.5	3
SS-1.5HLR	-5.4	-5.0	5
Bottom - (SS-1HLR & SS-1.5HLR)	-5.4	-5.2	4
Middle - (SS-1HLR and SS-1.5HLR)	-4.6	-3.5	4

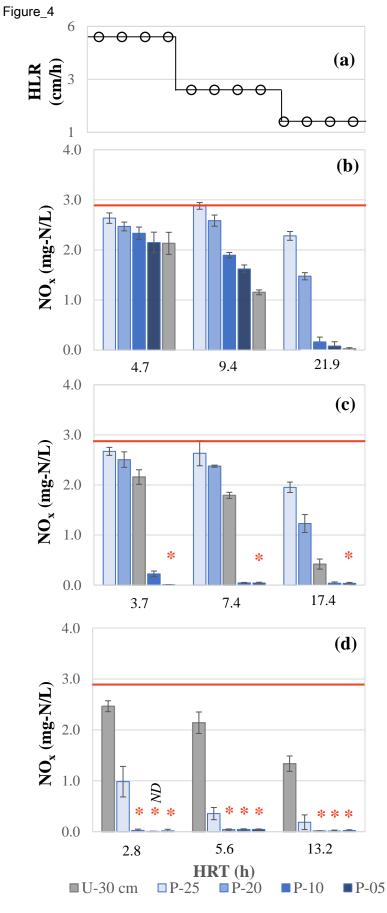
Table 2. Enrichment factors calculated for steady state events.



Steady state isotope data (a) dual isotope plot and (b) isotope enrichment plot.  $\delta^{15}N$  and  $\delta^{18}O$  plot along a denitrification line. Enrichment plot shows bottom and middle column plot along a line, but top column data do not, indicating low concentrations reflected the immobile zone rather than just denitrification. 0.156 mg-N/L (or < 4% of the TN concentration) and confirmed DNRA was not a primary pathway for NO<sub>x</sub> removal. Average effluent pH (across all SS events) increased relative to synthetic stormwater (7.06  $\pm$  0.03) to 7.36  $\pm$  0.07, 7.34  $\pm$  0.02, and 7.47  $\pm$  0.09 for the bottom, middle, and top underdrain, respectively.

HLR affected *in situ* IWS NO<sub>x</sub> concentration profiles as a function of depth (Fig. 4); 303 304 however, transport across all three columns varied due to the presence and size of immobile zones. In situ two dimensional IWS sampling proved a useful approach to identify where 305 processes occur and improve system design. For the bottom column, NO<sub>x</sub> concentrations 306 307 decreased as IWS sample port height decreased (i.e., approached the base). For SS-2.5HLR, average proximal IWS NO<sub>x</sub> concentrations decreased from 2.9 to 1.6 mg-N/L as sample port 308 height decreased from P-25 to P-05 cm (Fig. 4a). Additionally, the concentration difference 309 between the P-25 to P-05 IWS sample height (i.e., NO<sub>x</sub>(P-25) – NO<sub>x</sub>(P-05)) increased from 0.50 310 to 2.2 mg-N/L as HLR decreased from 5 to 1 cm/h (Fig. 4a). The increased differential is 311 attributed to increased residence time and consequently NO<sub>x</sub> removal where denitrification was 312 occurring. 313

IWS  $NO_x$  concentrations decreased substantially for regions below the middle and top 314 315 underdrain heights and is likely attributed to limited mass transport into the immobile zones. For example, NO<sub>x</sub> concentrations remained less than 0.04 mg-N/L for IWS locations P-20 through P-316 05 for the top column for SS-5HLR through SS-1HLR (Fig. 4c). Steady state bioretention 317 318 column NO<sub>x</sub> concentration profiles and dual isotope analysis coupled with tracer studies and flow modeling from previous work, suggest that while favorable conditions for denitrification 319 320 exists in regions below the top and middle underdrain heights, NO<sub>3</sub><sup>-</sup> removal is less efficient due 321 to limited mass transport (i.e., limited  $NO_3^-$  exchange into the immobile zones)(Donaghue et al.,



Steady state NO<sub>x</sub> concentration profiles as a function of IWS underdrain height and (a) hydraulic loading rate (HLR) for (b) bottom (c) middle, and (d) top columns. Error bars equal to  $\pm \sigma$ . Red asterisks (\*) denotes immobile zones. Hydraulic residence time (HRT) is based of effective PVs. ND = non-detect (0.008 mg-N/L). The solid red line notes the average tank concentration (2.9  $\pm$  0.26 mg-N/L).

2022). However, the degree of mass transport to the immobile zone is governed by the concentration gradient. Thus, higher influent  $NO_3^-$  concentrations would potentially increase mass transfer rates into this zone.

Velocity heat maps for the SS-1HLR (Fig. S3) illustrate the presence of immobile, or low 325 flow, zones below the middle and top underdrain. Column tracer experiments and VS2DRTI 326 flow and transport modeling conducted by this research group (Donaghue et al., 2022) for the 327 same experimental design demonstrated the presence of immobile zones below the top 328 underdrain (thickness  $\leq 20$  cm) and middle underdrain (thickness  $\leq 5$  cm). Calculated hydraulic 329 330 efficiencies (e<sub>v</sub>), the mean tracer residence time divided by the theoretical residence time, and tracer breakthrough curve statistics supported the presence of immobile zones. Specifically,  $e_v$ 331 decreased from 1.0 to 0.76 as underdrain height increased from 1 to 30 cm. Hydraulic 332 efficiencies < 1 indicate non-ideal flow where the mean tracer residence time is less than the 333 theoretical residence time-an undesirable design scenario where treatment volume is 334 underutilized. The presence of immobile zones suggests nonequilibrium flow where fluid is 335 partitioned into regions of mobile (flowing) and immobile (stagnant) zones. Nonequilibrium flow 336 includes a mass transfer coefficient as a third parameter to account for exchange between mobile 337 338 and immobile zones (Field and Pinsky, 2000).

The effect of IWS underdrain configuration on system hydraulics and transport processes will also be influenced by the IWS width to depth ratio. The presence of immobile zones below the middle and top underdrain was specific to a case where the IWS width to depth ratio equaled 0.5 (15 cm width/30 cm depth). Two-dimensional flow patterns were observed in mobile regions of the IWS (Fig. S3) with higher velocity zones closest to the underdrain location. As a result, distal sample ports had longer residence times and demonstrated lower NO<sub>3</sub><sup>-</sup> concentration

profiles (Fig. S4). Simulations performed by our research group elsewhere (Donaghue et al.,

346 2022) also considered IWS width to depth ratios greater than 1 (50 cm width/30 cm depth). For

this scenario hydraulics efficiencies ranged 0.89 to 0.96 and immobile zones comprised less than

<sup>348</sup> 2% of the IWS. For IWS width to depth ratios greater than 1, velocity heat maps showed a wider

349 distribution of velocities. While simulations indicated immobile zones were minimal for a IWS

width to depth ratio of 1.67, maximizing HRT will still be an important factor for achieving

351 higher  $NO_3^-$  removal efficiency.

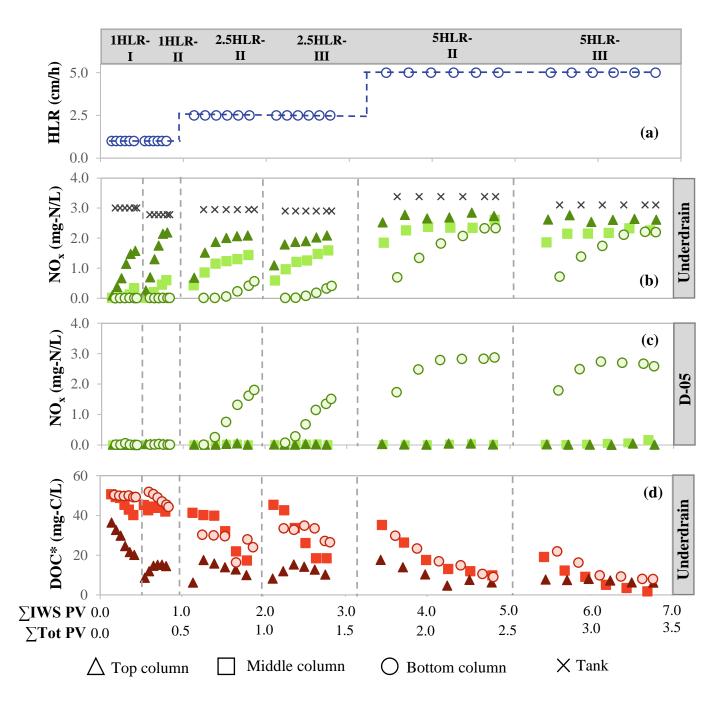
## 352 *3.2. Zero-order kinetics and evidence of IWS aging*

Underdrain NO<sub>x</sub> removal demonstrated a linear correlation with HRT (Fig. 2). For events 353 SS-5HLR through SS-1HLR, higher correlations were observed for zero-order ( $k_0 = 3.21 \text{ g-N*m}^-$ 354  $^{3}$ \*d<sup>-1</sup>, r<sup>2</sup> = 0.946, Fig. S5a) compared to first-order kinetic estimates (k<sub>1</sub> = 4.25 d<sup>-1</sup>, r<sup>2</sup> = 0.790, 355 Fig. S5b). The rate model employed by Peterson et al. 2015 was used to determine rate constants 356 (details in SI). Often, NO<sub>3</sub><sup>-</sup> removal kinetics are considered zero-order where the reaction rate is 357 controlled by an independent parameter (i.e., HRT or release of DOC from woodchips) rather 358 than  $NO_3^-$ . Halaburka et al. observed zero-order kinetics for "aged" (saturated > 13 months) 359 woodchip bioreactor columns for an input  $NO_3^-$  concentration of 10 mg-N/L and constant 360 temperature (2017). First-order removal rates have been reported for laboratory bioreactor 361 columns (influent of 1 to 6 mg-N/L)(Igielski et al., 2019). Additionally, transition to first-order 362 kinetics may occur at lower  $NO_3^{-}$  concentrations (<0.5 mg-N/L)(Schipper et al., 2010). Addy et 363 al. compiled data across 26 peer reviewed papers which included 14 bed field studies and 10 364 laboratory column woodchip bioreactor studies (2016). Authors reported that  $NO_3^{-1}$  removal rates 365 during the first year were more than 3 times higher than aged systems. Therefore, rates after year 366 367 one of operation are more representative of performance long-term. Interestingly, columns in this current paper operated 5 months and did not meet the definition of "aged". Yet, observed zeroorder rates agree with mean NO<sub>3</sub><sup>-</sup> removal rates (2.8 g-N\*m<sup>-3</sup>\*d<sup>-1</sup>) for "aged" (13 to 24 month) bioreactors rather than younger (< 13-month-old) bioreactors (9.1 g-N\*m<sup>-3</sup>\*d<sup>-1</sup>) (Addy et al., 2016).

During SS-1.5HLR-postdormant (orange symbology, Fig. 2), removal rates for the 372 373 middle and bottom underdrain decreased by 46% and 23%, respectively. These decreases are relative to the pre-dormant performance and the percent removal deviated from linear trends 374 observed during SS-5HLR through SS-1HLR (green symbology). NO<sub>3</sub><sup>-</sup> removal rates can vary 375 376 during the initial one to three years of operation before stabilizing (Addy et al., 2016). One column study using wood pulp and sand media reported a 50% decline in  $NO_3^-$  removal 377 efficiency within 1 year of operation (Robertson et al., 2008). Higher NO<sub>3</sub><sup>-</sup> removal rates that 378 occurred during early operation were attributed to woodchips leaching excess organic material, 379 but leaching rates stabilized after extended use (Halaburka et al., 2017). For bioretention 380 systems, IWS media may not remain permanently saturated between precipitation events due to 381 evapotranspiration and exfiltration to underlying media. The 4.5-month dormant period during 382 COVID here represented an exaggerated ADP case. However, the observed decline in NO<sub>3</sub><sup>-</sup> 383 384 removal for the bottom and middle underdrains suggest prolonged exposure to semi-saturated conditions could contribute to woodchip aging. As stated above, the isotope data showed the 385 largest fractionation for a single sample in SS-1HLR, but similar enrichment factors before and 386 387 after the 4.5-month dormant period (Table 2).

388 *3.3.* NO<sub>x</sub>, dual isotope, and water quality patterns for transient events under different HLR

As transient event HLR increased, a higher fraction of old IWS water was replaced with new incoming synthetic stormwater. Consequently, NO<sub>x</sub> concentrations (Fig. 5b) and the mass



Water quality results for transient events withs variable hydraulic loading rate (HLR). Prior to transient events, a total of ~150 total PVs were applied to each column across steady state conditions and tracer tests. \*absorbance measured at 254 nm.

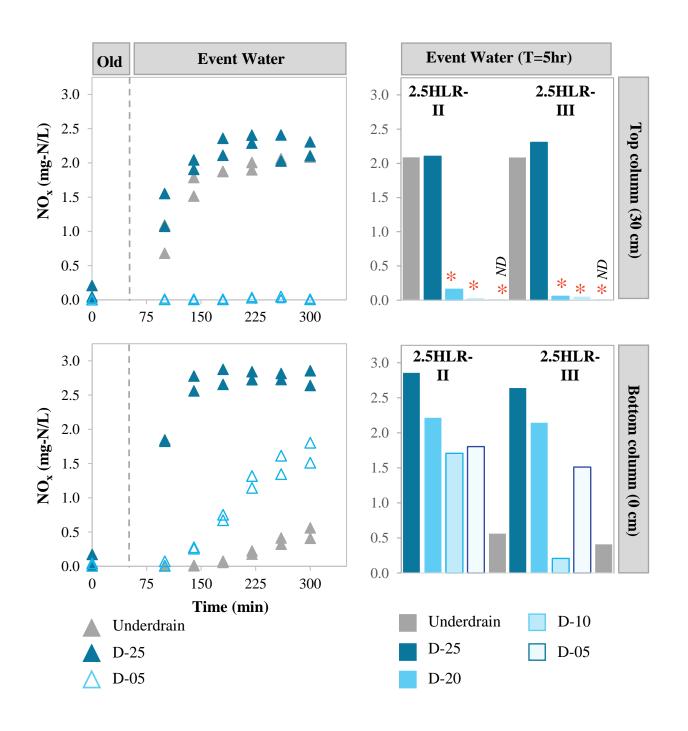
391	flux of $NO_x$ leaving the system (Table S7) increased at the underdrain for all three columns. In
392	between transient flow, water was stored in the IWS for a prolonged residence time (7 days)
393	(Trans-1HLR-I through Trans-5HLR-III) and is more relevant to field conditions. The bottom
394	column performed best in minimizing the mass flux of $NO_x$ from the underdrain followed by the
395	middle and the top columns (Fig. 5b, Table S7). For the highest HLR (5 cm/h) tested during
396	transient events, the applied IWS pore volume was 2.3 (total pore volume equaled 1); the final
397	$C/C_0$ ranged from 0.69 to 0.84 (Fig. 5b, Fig. S6) and suggested NO <sub>3</sub> <sup>-</sup> removal. Furthermore, final
398	$C/C_o$ for Trans-5HLR was similar to $NO_3^-$ removal efficiency (=100%*(1-C/C_o)) observed
399	during steady state, SS-5HLR, which ranged from 10 to 25% (C/C <sub>o</sub> = $0.75$ to 0.90).
400	NO <sub>x</sub> concentration profiles for the D-05 location highlighted the underutilization of
401	treatment volume for a portion of the IWS below the middle and top columns during events (Fig.
402	5c). For Trans-2.5HLR and Trans-5HLR, the bottom column NO <sub>x</sub> concentration profiles for the
403	underdrain and D-05 followed similar breakthrough patterns (Fig. 5c). Average normalized peak
404	$NO_x$ concentrations for the bottom column D-05 location equaled 0.57 and 0.84 mg-N/L for
405	Trans-2.5HLR and Trans-5HLR, respectively. In contrast, the middle and top column,
406	normalized $C_{peak}$ NO <sub>x</sub> concentrations at the D-05 location remained 97% less than the influent
407	concentration across all HLR events (Fig. 5c). Low NO <sub>x</sub> concentrations observed at D-05 for the
408	middle and top column are likely attributed to presence of an immobile zone and limited mass
409	transport below raised underdrains (Donaghue et al., 2022). However, the IWS volume below
410	raised underdrains was not entirely characterized by an immobilize zone. Top column IWS $NO_x$
411	concentration profiles at the conclusion of Trans-2.5HLR-II and III demonstrated that mixing
412	and mass transport occurred a certain depth below the underdrain (Fig. 6a). For example, D-25

413 NO<sub>x</sub> was ~2.2 mg-N/L but ranged from non-detect to 0.16 mg-N/L for location D-05 to D-20
414 (Fig. 6a).

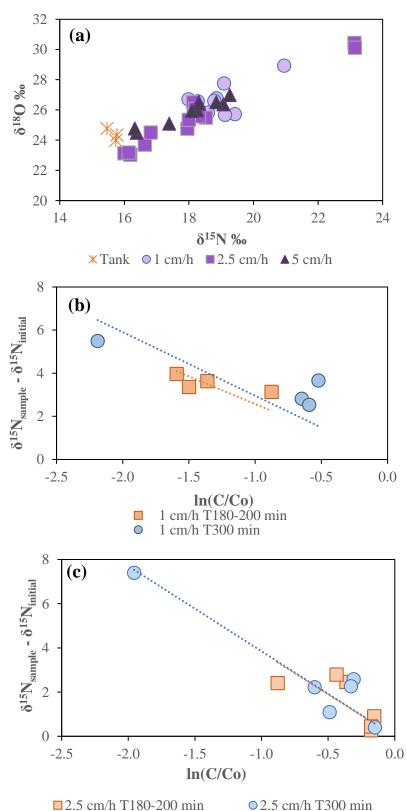
415	Old IWS water (t = 0 min) $NO_x$ concentrations were considerably lower relative to the
416	final event concentrations (t = $300 \text{ min}$ ) (Fig. 6). This cycle is observed over multiple events
417	(Fig. 5) and suggested that $NO_x$ removal also occurred between storms. For example, at the
418	conclusion of Trans-2.5HLR-I (t=300 min sample time) the bottom column IWS NO <sub>x</sub>
419	concentrations were 2.9 mg-N/L (D-25) and 1.8 mg-N/L (D-05) (Fig. 6a, Table S8). In contrast
420	corresponding old IWS water $NO_x$ concentrations declined more than 94% and equaled 0.17 mg-
421	N/L (D-25) and 0.04 mg-N/L (D-05) (Fig. 6b).
422	All three columns showed a linear slope between $\delta^{15}N$ and $\delta^{18}O$ (Fig. 7a) and isotope
423	enrichment factors indicated denitrification (Table 3) albeit with limited data for the top column
424	due to little change in NO <sub>3</sub> <sup>-</sup> concentrations. Trans-1HLR and Trans-2.5HLR showed roughly half
425	the enrichment of steady state (-2.7 to -3.8 for $\delta^{15}N$ and -1.6 to -2.9 for $\delta^{18}O$ ), while Trans-5HLR
426	showed higher enrichment (-7.6 to $-9.6$ for $\delta^{15}N$ and $-5.1$ to $-6.5$ for $\delta^{18}O$ ). However, there were
427	limited data for the middle and top columns for Trans-5HLR; additionally, some points did not
428	fall on a linear enrichment trend (e.g., the bottom underdrain at $t = 180$ min; Fig. S7). Where
429	sufficient data were available, the slopes (enrichment factors) for $t = 180$ min and $t = 300$ min
430	were similar, excluding the outliers (Fig. 7b,c). In some cases (Trans-1HLR and top column
431	Trans-2.5HLR) the $\delta^{18}$ O data were not linear, unlike the steady state conditions. The higher
432	enrichment for Trans-5HLR may be a reflection of more NO3 <sup>-</sup> mass that was applied and
433	available for processing at the higher flow. For example, ~50 mg-N were applied for Trans-
434	5HLR compared to ~10 mg-N applied during Trans-1HLR.

Table 3. Enrichment factors calculated for transient events. Points that did not fall on a linear trend were excluded from the slope calculation as indicated under the Dataset column. For the bottom column intermediate time is 200 minutes, and for the middle and top columns it is 180 minutes. Orange shading indicates insufficient data.

Event	Dataset	<sup>15</sup> N enrichment (ε)	<sup>18</sup> O enrichment (E)	Number of points
Trans-1.5HLR	all	-2.7	-1.6	8
Trans-2.5HLR	all but bottom column T200min	-3.8	-2.9	12
Trans-5HLR	all but bottom column D-05 and D-25, T200min	-7.6	-5.1	6
Trans-1HLR	all	-2.7	-1.6	8
Trans-1HLR	bottom column	-2.9		$2 \delta^{18}$ O not linear
Trans-1HLR	middle column	-2.7	-1.8	2
Trans-1HLR	top column	-2.7	-1.8	4
Trans-2.5HLR	all but bottom underdrain T200min	-3.8	-2.9	12
Trans-2.5HLR	bottom column	-3.7	-3.0	3
Trans-2.5HLR	middle column	-3.0	-1.8	4 (2 off scale)
Trans-2.5HLR	top column			4 (not linear)
Trans-5HLR	all but bottom column D-05, D-25 T200 min	-7.6	-5.1	6
Trans-5HLR bottom c.	bottom column	-7.5	-5.1	4
Trans-5HLR Trans-5HLR	middle column top column			1 insufficient data 1 insufficient data
Trans-1HLR	all	-2.7	-1.6	8
Trans-1HLR	T300 min	-2.9	-2.0	4
Trans-1HLR	T180-200 min	-2.6		$4 \delta^{18}$ O not linear
Trans-2.5HLR	all but bottom underdrain T200 min	-3.8	-2.9	12
Trans-2.5HLR	T300 min	-3.8	-3.0	6
Trans-2.5HLR	T180-200 min	-3.8	-2.8	6
Tanns-5HLR	all but bottom column D-05, D-25 T200 min	-7.6	-5.1	6
Trans-5HLR	T300 min	-9.6	-6.5	5
Trans-5HLR	T180-200 min			1 insufficient data



Comparison  $NO_x$  concentration profiles for top and bottom columns for Trans-2.5HLR event. \*denotes immobile zones. ND = non-detect (0.008 mg-N/L). Event water includes mixture of old IWS water and new synthetic stormwater.



Transient isotope data for (a) dual isotope plot and isotope enrichment plots for (b) Trans-1HLR and (c) Trans-2.5HLR events. Insufficient data to compare time steps for Trans-5HLR events.  $\delta^{15}$ N and  $\delta^{18}$ O plot along a denitrification line for all three HLR. Enrichment plot shows similar slopes for time steps (T) of 180-200 min and 300 min samples. For the bottom column intermediate time is 200 minutes, and for the middle and top columns it is 180 minutes.

435	During transient flow, effluent pH was less than synthetic stormwater (~7.0) and effluent
436	peak DOC concentrations were associated with old IWS water and occurred at the beginning of
437	events. Hydrolysis of woodchips produces volatile fatty acids and is associated with a decrease
438	in pH (Lynn et al., 2015a). Except for event Trans-1HLR-I, average effluent pH was 6.7 (bottom
439	underdrain) and 6.6 (middle and top underdrains) (Table S9). Other woodchip bioreactor
440	columns demonstrated decreased pH relative to influent conditions under transient flow (Lynn et
441	al., 2015a; Peterson et al., 2015). During dry periods, fungi and bacteria can degrade
442	lignocellulose biomass like woodchips which increases DOC concentrations in porewater (Lynn
443	et al., 2015b; Malherbe and Cloete, 2002). Concomitant with decreased pH, effluent DOC
444	concentrations spiked at the beginning of event sampling (first ~0.1 to 0.25 total PVs) except for
445	the top underdrain (Fig. 5d). Compared to steady state conditions, transient IWS water quality
446	highlights the role dry periods play in promoting DOC leaching for potential denitrification.
447	DON was observed in effluent across all three columns (Fig. S8a) and $NH_4^+$ was non-detect for
448	most events (Fig. S8b) (see discussion in SI).
449	Generally, the top column resulted in lower effluent DOC mass flux (Table S7, Fig. S9
450	and DOC concentrations (Fig. 5d) from the underdrain. This is attributed to more mixing
451	between old IWS water and new water during events compared to the bottom column. For the
452	Trans-5HLR scenario, $NO_x$ and DOC mass flux released from the bottom underdrain were 298
453	mg-N/m <sup>2</sup> and 3,560 mg-C/m <sup>2</sup> , respectively compared to 564 mg-N/m <sup>2</sup> and 1980 mg-C/m <sup>2</sup> for the
454	top underdrain (Table S7). For the middle underdrain, $NO_x$ and DOC mass fluxes were 449 mg-
455	$N/m^2$ and 3,360 mg-C/m <sup>2</sup> for Trans-5HLR scenarios. Opposing trends observed between effluent
456	DOC and NO <sub>x</sub> mass fluxes highlight two important considerations regarding underdrain
457	placement. First, under transient conditions, raised underdrains promote mixing between old

IWS water and new water relative to the bottom column and provide an opportunity to utilize 458 DOC built up during ADPs for denitrification. For the top column, old IWS water DOC 459 concentrations ranged from 3.8 to 26 mg-C/L for P-25 and ranged from 30 to 36 mg-C/L for P-460 05 (Fig. S10a). In contrast, old IWS water DOC concentrations for the bottom column were 461 consistent across the P-25 and P-05 locations (Fig. S10a). Following application of new 462 stormwater two trends occurred for the top column: 1) P-05 IWS DOC concentrations spiked and 463 2) the final event concentration gradient between the P-25 and P-05 increased with increasing 464 HLR. For example, the gradient ranged from 0.41 to 0.76 mg-C/L/cm for Trans-1HLR and 465 ranged from 2.2 to 2.7 mg-C/L/cm for Trans-5HLR (Fig. S10a). During transient flow for the top 466 column, incoming new stormwater pushed a fraction of old IWS water, with increased DOC, to 467 the P-05 location. This transport phenomena was supported by transient chloride tracer storms 468 conducted previously where chloride (a conservative tracer) accumulated at the P-05 location 469 over the course of four transient events (Fig. S4 in Donaghue et al., 2022). However, DOC 470 concentrations in old IWS water declined before the next event suggesting utilization (Fig. S10a-471 c) and likely higher DOC mass transfer rates to immobile regions during flow conditions. A 472 second consideration for underdrain placement is that for bioretention systems, release of labile 473 474 DOC to receiving water bodies is also an undesirable outcome and could potentially increase the biological oxygen demand. 475

Column studies with a bottom underdrain IWS commonly assume ideal plug flow when describing NO<sub>3</sub><sup>-</sup> removal (Igielski et al., 2019; Lynn et al., 2017; Subramaniam et al., 2016) and immobile zones are assumed absent or minimal. However, flow conditions were classified as non-ideal for the middle and top columns as demonstrated by hydraulic efficiencies  $\leq 1$ (Donaghue et al., 2022). The extent of the immobile zone is also impacted by the HLR; we

previously demonstrated that the immobile zone fraction decreased from 36 to 14% as HLR
increased from 4 to 13 cm/h (Donaghue et al., 2022). Thus, site infiltration rates will also
influence optimal underdrain height within the IWS in order to promote mixing with old IWS
water and enhance NO<sub>3</sub><sup>-</sup> removal during storm events.

485 3.4. Impact of ADP on  $NO_x$  and isotope patterns

For ADP conditions, the NO<sub>x</sub> mass flux increased in the order of bottom column <486 middle column < top column and longer ADPs generally resulted in lower NO<sub>x</sub> mass fluxes 487 (Table S7) and concentrations from the bottom and middle columns. For example, the middle 488 underdrain average NO<sub>x</sub> mass flux was 69 mg-N/m<sup>2</sup> after 14 days compared to 106 mg-N/m<sup>2</sup> 489 after 3 days (Table S7). Final normalized NO<sub>x</sub> concentrations ( $C/C_0$ ) for the middle underdrain 490 decreased from 0.55 to 0.26 as ADP increased from 3 to 14 days. For the top underdrain, average 491  $NO_x$  mass flux decreased from 215 to 166 mg-N/m<sup>2</sup> as ADP increased from 3 to 7 days; the 492 average mass NO<sub>x</sub> flux was 188 mg-N/m<sup>2</sup> following 14 days. Unlike the middle underdrain, final 493 normalized NO<sub>x</sub> concentrations ranged 0.70 to 0.74 and did not show a decreasing trend as ADP 494 495 increased from 3 to 14 days.

DOC concentrations in old IWS water generally did not increase as ADP increased from 496 3 to 14 days, with the exception of a few events. For example, P-05 old IWS water DOC 497 concentrations ranged from 18.5 to 30.2 mg-C/L across the variable ADPs considered (Fig. 498 S11a). But old IWS water DOC concentrations for the middle column P-05 increased from 16 to 499 31 mg-C/L between consecutive events Trans-7ADP-III and Trans-14ADP-II (Fig. S11b). 500 Previous columns studies with similar IWS media composition reported increasing old IWS 501 water DOC concentrations as ADP increased from 0 to 16 days (analytical methods differed) 502 (Lynn et al., 2015a). Authors attributed concurrent DOC build up with increased dry periods to 503

504	DOC leaching rates exceeding DOC utilization rates. However, Lynn et al. observed that DOC
505	leaching declined over longer ADP periods; the maximum DOC concentration of $\sim$ 114 mg-C/L
506	occurred following a 14 day ADP but decreased to ~ 76 mg-C/L after a 30 day ADP (2015a).
507	Isotope data collected to monitor ADP focused on evaluating the end of the dry period
508	(labeled as $t = 0$ min associated with the subsequent transient event). The isotope data neither
509	confirmed nor contradicted the ADP assessment because NO3 <sup>-</sup> concentrations were low at the
510	end of the dry periods. These low concentrations limited analytical precision for the isotope
511	analysis. Only one sample submitted for analysis met the data quality requirements. The one
512	sample with sufficient $NO_3^-$ indicated a second source of $NO_3^-$ released during the dry period
513	with 2‰ lower $\delta^{15}$ N than the synthetic stormwater composition (likely woodchip organic
514	matter). Five samples that were below the suggested detection limits also showed lower $\delta^{15}N$
515	than the synthetic stormwater. A possible scenario is that fractionation went to completion and
516	the isotope signal for denitrification was "lost". This highlights an important consideration when
517	incorporating isotope analysis and suggests isotope sample collection should target the time
518	period immediately following the storm event (i.e., ~3-5 h post storm) rather than the end of the
519	ADP.

### 520 3.5. IWS design considerations and environmental implications

IWS design for water quality and  $NO_3^-$  removal is relevant to nutrient sensitive watersheds where one point of regulation is storm sewer systems. Under these applications, maximizing HRT during a storm event is critical to enhance  $NO_3^-$  removal during a storm. For example, the underdrain could extend several feet from the outlet structure rather than span the entire length of the basin. This design would increase travel time. While not tested in this study, other design components in addition to IWS underdrain height can be included to enhance water quality. For example, an area of impermeable liner could be placed between overlying fill media and the IWS near the outlet location to prevent suspected short circuiting. Additionally, baffles
could be implemented into the IWS to minimize immobile zones.

530 Operation and maintenance considerations may also influence IWS underdrain 531 placement. Gas buildup from denitrification can cause impediments to flow and was observed to 532 occur during ADPs of this study. Between storms, raised underdrains provide a release conduit, 533 which may help maintain intended hydrology. We recognized in our previous work that issues 534 with the underdrain clogging, due to sediment, are minimized when the underdrain is raised 535 compared to bottom underdrain configurations (Donaghue et al., 2022).

In situ IWS sampling reveals spatial and temporal variations related to transport 536 processes. Limiting sampling to inlet and outlet locations may overlook the presence and 537 influence of immobile zones on system performance-a critical component to improving GSI 538 design. Additionally, dual isotope analysis is a valuable tool to distinguish whether low NO<sub>3</sub><sup>-</sup> 539 concentrations are a result of denitrification or dilution during storm events. However, the 540 541 application of dual isotope approaches is limited for studying dry periods if NO<sub>3</sub><sup>-</sup> concentrations are below detection limits. Therefore, it is important to collect enough samples to follow 542 temporal trends before dilution occurs. If additional NO<sub>3</sub><sup>-</sup> sources occur during prolonged ADPs, 543 544 dual isotopes can be used to identify them in field or laboratory systems.

#### 545 **4. Conclusions**

546 Specific conclusions from this study include the following:

NO<sub>3</sub><sup>-</sup> removal efficiency increased with increasing HRT and zero-order kinetics were
 observed across all three IWS underdrain heights for steady state. As a result, IWS design
 strategies that increase HRT will enhance NO<sub>3</sub><sup>-</sup> removal efficiency. For steady state

550	conditions tested here, the bottom column always outperformed the middle and top
551	columns with respect to NO <sub>x</sub> removal because of longer residences times.
552 •	Steady state NO <sub>x</sub> removal decreased following a 4.5-month duration when the IWS was
553	partially saturated. Woodchip longevity and effectiveness may become compromised in
554	climates with extended dry periods or if the IWS water level lowers due to exfiltration
555	between storms. Impermeable liners at the base of IWS could help to mitigate this
556	challenge.
557 •	Under steady state conditions, immobile zones, created by underdrains at the top of the
558	IWS, reduced hydraulic efficiency and limited denitrification despite low DO and a
559	sufficient carbon source. Contrasting NO3 <sup>-</sup> isotope enrichment trends support this
560	conclusion, where the mobile zone exhibited linear $NO_3^-$ isotope enrichment response
561	(for both isotopes) compared to non-linear $NO_3^-$ isotope enrichment response for the top
562	column.
563 •	For transient events, a linear NO3 <sup>-</sup> isotope enrichment response was observed across all
564	columns regardless of IWS underdrain height. While effluent NO <sub>x</sub> concentrations
565	converged across all columns for the highest HLR, the top underdrain resulted in lower
566	effluent DOC mass fluxes. These results suggests that during storm conditions, top
567	underdrains enhance mixing between old IWS water and new stormwater which allows
568	microbes to utilize DOC built up during ADPs and enhance denitrification during storm
569	events.
570 •	An IWS underdrain configured at the bottom of the IWS increased residence time but can
571	force plug flow conditions that limit mixing with old IWS water and utilization of DOC.

- 572 IWS design for water quality enhancement will require incorporating measures that
- 573 balance denitrification with DOC exportation. Design decisions may include an
- underdrain located mid depth of the IWS to promote mixing, shortening the length of the
- 575 underdrain to minimize short circuiting, or incorporating impermeable liners at discrete
- 576 locations between fill media and the IWS to increase travel times.
- 577

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# 581 Appendix A. Supplementary material

582 Supplementary material to this article can be found on the online version.

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