- 1 Technical Note: Testing an improved index for analysing storm discharge-concentration hysteresis.
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- 12 Abstract

Analysis of hydrochemical behaviour during storm events can provide new insights into the process 13 14 controls on nutrient transport in catchments. The examination of storm behaviours using hysteresis 15 analysis has increased in recent years, partly due to the increased availability of high temporal 16 resolution datasets for discharge and nutrient parameters. A number of these analyses involve the 17 use of an index to describe the characteristics of a hysteresis loop in order to compare different 18 storm behaviours both within and between catchments. This technical note reviews the methods for 19 calculation of the hysteresis index (HI) and explores a new more effective methodology. Each 20 method is systematically tested and the impact of the chosen calculation on the results is examined. 21 Recommendations are made regarding the most effective method of calculating a HI which can be 22 used for comparing data between storms and between different parameters and catchments.

24 1. Introduction

The analysis of hysteresis patterns is a key tool for the interrogation of in-stream physical and 25 26 chemical responses to storm events, which have been shown to be important periods for the 27 transport of nutrients and sediment within catchments (Bowes et al., 2003; Jarvie et al., 2002; Jordan et al., 2007; Burt et al., 2015; Evans and Johnes, 2004). In the context of this paper, hysteresis is 28 29 defined as the nonlinear relationship between discharge and concentration of nutrients or sediment. 30 When discharge-concentration data are plotted a cyclic pattern is often observed, the strength of the relationship is dependent on the nature of the lag in response between the two variables. 31 32 Quantification of hysteresis allows multiple storm behaviours to be examined between and within 33 catchments, for a wide range of hydrological and hydrochemical parameters. This can provide insight 34 into catchment function, allowing the development and testing of process-based understanding. This type of analysis has been used in recent years by many authors investigating nutrient 35 36 concentration-discharge relationships in catchments of differing environmental character (e.g. Bowes et al., 2015; Darwiche-Criado et al., 2015; Cerro et al., 2014; Rodriguez-Blanco et al., 37 38 2013;Oeurng et al., 2010;Eder et al., 2010;Evans and Johnes, 2004) but, traditionally, has been used for the examination of turbidity or suspended sediment data (e.g. Ziegler et al., 2014; House and 39 40 Warwick, 1998;Williams, 1989;Tena et al., 2014;Klein, 1984;Whiting et al., 1999). Hysteresis analysis 41 has been used to support the investigation of the temporal variations in nutrient transport to 42 streams as a means of characterising the likely contributing source areas and flow pathways linking 43 source to stream in complex landscapes (Outram et al., 2014; Bowes et al., 2015; Lloyd et al., 2016). 44 Similar hysteresis patterns can be observed for a variety of different reasons, however it is generally 45 assumed that clockwise hysteresis, caused by a small or no lag between discharge and concentration 46 suggests a source close to the monitoring point. Conversely, anti-clockwise hysteresis generally 47 signifies a longer lag between the discharge and concentration peak, suggesting that the source was 48 located further from the monitoring point. (Williams, 1989) provides a detailed summary of different 49 shape hysteresis plot and the possible mechanisms.

50 For hysteresis analysis to be effective and easy to interpret there is a need to develop an effective 51 method of classifying storms according to their hysteretic behaviour. Many papers have classified storms into clockwise or anticlockwise responses, and described the strength of the hysteresis as 52 53 small or large (Bowes et al., 2015; Evans and Davies, 1998; Butturini et al., 2008). Other authors have 54 used an index approach, which allows a dimensionless quantification of the hysteresis, and thus, 55 comparison of hysteresis indices between catchments of differing size, morphology and hydrological 56 function. An index approach is also useful as it provides information about both the direction and 57 strength of the hysteresis. Hysteretic indices proposed by Butturini et al. (2008) provide semi58 quantitative methods to describe whether the measured parameter is enriched or diluted during a 59 storm event and to assess the area inside the hysteresis loop, along with its direction. Langlois et al. (2005) propose a quantitative method which involves splitting the discharge hydrograph into the 60 61 rising and falling limb and fitting regression lines to each dataset. The hysteresis index is calculated 62 as the ratio (rising:falling) of the areas under the regression curves. Whilst this index provides a 63 quantitative solution, the authors suggest that the method should only be applied to simple unidirectional loops, i.e. not those which exhibit figure-of-eight or more complex behaviours. A 64 quantitative index was also proposed by Lawler et al. (2006), which uses the ratio of the turbidity (or 65 other parameter) concentration on the rising and falling limb, at the mid-point in the discharge. The 66 67 mid-point in discharge is defined as 50% of the range in discharge during the storm event. This index 68 has been used by a number of other authors (McDonald and Lamoureux, 2009;Outram et al., 2014), 69 as it is flexible and can be applied to hysteresis loops of all shapes. However it is not without 70 limitations. In a recent paper, Aich et al. (2014) highlight that the index of Lawler et al. (2006) in its 71 current form becomes skewed at higher concentrations, with a smaller index calculated for loops of 72 the same shape and area in the case of storms commencing at a higher concentration (Figure 1a). In 73 addition, the calculation of the index using only the mid-point (50%) in discharge can be problematic. 74 Lawler et al. (2006) state that the mid-point was used as it avoids the often noisy sections at the 75 beginning and end of the loops. However, the result of the calculated index may be misleading in 76 many figure-of-eight scenarios, especially those which cross close to the mid-point in discharge (see 77 Figure 1b). The example shown in Figure 1b illustrates that a hysteresis index (HI) calculated at the 78 mid-point in discharge would suggest that there was very little hysteresis, even though there is a 79 strong effect but in different directions during different periods of the storm event. As suggested by 80 Lawler et al. (2006), the HI can be calculated at multiple increments through the flow range and an 81 average HI value gained. Against the above background, this technical note reports the impact of the 82 chosen method on the index values generated from a series of storms of varying size and hysteretic shapes, using an adapted version of the Lawler et al. (2006) index (HILA). The paper also introduces a 83 84 new method for calculating the hysteresis index (HI_{new}) and, as a result of this analysis, suggests a 85 recommendation for the most appropriate calculation for a HI for storm-driven nutrient transport in 86 catchments.

87 2. Methodology

88 2.1 Datasets

The example uses a series of storms extracted from high-temporal resolution (15-min) data collected on the River Wylye at Brixton Deverill (Wiltshire, UK) as part of the Defra Demonstration Test

91 Catchment project (McGonigle et al., 2014) from March 2012 to March 2014. Detailed descriptions 92 of the field site and the datasets are available in previously published work (Lloyd et al., 2015, in 93 revision). For the purposes of this study, discharge data were obtained from the Environment Agency gauge (Gauge Number 43806) and turbidity data were collected using a YSI 6-series sonde, 94 95 which was cleaned and calibrated once a month over the monitoring period. Turbidity (measured in 96 Nephelometric Turbidity Units (NTU)) was chosen for this study as it is the most widely examined 97 parameter in terms of hysteresis and the storms selected from the data set exhibit a wide range of 98 turbidity values and hysteretic shapes. A total of 66 storms were extracted for this analysis from the 99 two year observational data. A storm was classified as an increase in discharge of more than 20% 100 above baseflow and the end of the storm was determined by either a return to baseflow conditions 101 or when discharge began to rise again if another storm occurred before the system had returned to 102 baseflow conditions. Previous work had quantified the uncertainty associated with the discharge and turbidity measurements (Lloyd et al., 2015;Lloyd et al., 2016) and this provided 100 resampled 103 104 iterations of each measured parameter for every storm, accounting for observational uncertainties, for this analysis. Figure 2a-f(I) shows some example storms, where the boxes represent the 5th-95th 105 106 percentile uncertainty range for each data point.

107 2.2 Lawler et al. (2006) method and modification

The HI was then calculated according to the standard method of Lawler et al. (2006) (HI_L) for combinations of all 100 iterations of each of the storms to provide a distribution of HI when the midpoint in discharge was calculated (50%). The Lawler et al. (2006) method was also adapted (HI_{LA}), where HI was calculated at every 25%, 10%, 5% and 1% increments of the discharge (see Figure 3 for visualisation) as shown below:

113 if $T_{RL} > T_{FL}$ (clockwise hysteresis):

114
$$HI_L = \left(\frac{T_{RL}}{T_{FL}}\right) - 1 \tag{1}$$

115 Or, if $T_{RL} < T_{FL}$ (anti-clockwise hysteresis):

116
$$HI_L = \left(-1/\frac{T_{RL}}{T_{FL}}\right) + 1$$
 (2)

117

118 Where: T_{RL} is the value of turbidity at a given point in flow on the rising limb and T_{FL} is the value on 119 the falling limb. 120 When multiple sections per storm were calculated, the average value was taken to represent the HI 121 of the complete storm event. In some cases there were not corresponding values on both the falling and rising limbs, when this occurs the maximum number of available pairs of data were used to 122 123 calculate the index. This only usually occurred at lowest discharges and when a large number of 124 intervals were being analysed. This meant that the number of missing pairs was small compared with 125 the available pairs (<5%) and as a result had little impact on the overall calculation. The analyses were completed for both the raw data and for normalised storms to assess the impact of the 126 127 different analysis methods on the HI values obtained. The data were normalised using the following 128 equations:

129 Normalised
$$Q_i = \frac{Q_i - Q_{min}}{Q_{max} - Q_{min}}$$
 (3)

130 Normalised
$$T_i = \frac{T_i - T_{min}}{T_{max} - T_{min}}$$
 (4)

131 Where: Q_i/T_i is the discharge/turbidity at timestep *i*, Q_{min}/T_{min} is the minimum storm parameter value 132 and Q_{max}/T_{max} is the maximum storm parameter value.

133 2.3 Proposed new Hysteresis Index method (HI_{new)}

A new method of calculating a HI was also tested (*HI_{new}*) with the aim of eliminating the impact of a changing baseline value on the ratio as multiple measurements are taken from the same storm. The new index uses the difference between the turbidity values on the rising and falling limbs of the normalised storms, rather than a ratio, and effectively normalises the rising limb at every measurement point, thereby resulting in an index between -1 and 1.

$$HI_{new} = T_{RL_norm} - T_{FL_norm}$$
(5)

As with the other methods, the analysis was carried out using different intervals of discharge (25%,
10%, 5% and 1%) and the mean was used as the final HI value for the storm. The impact of this
number of chosen intervals of discharge on the magnitude of the resulting HI was tested.

143 The resulting distributions of HI values for each method were then scrutinised using boxplots. 144 Differences between the distributions of data for each storm were analysed statistically using ANOVA where normality and variance assumptions were met, and the non-parametric alternative 145 146 Kruskal-Wallis-H on ranked data where the ANOVA assumptions did not hold. When a significant 147 difference between the groups was detected, a pairwise Tukey test was used to establish which of 148 the groups were contributing to the effect. The main aim of the analysis was to determine the point at which sufficient intervals of discharge were used so that there was no statistically significant 149 150 difference between the different datasets for each storm.

151 3. Results and discussion

152 A total of 66 storms were analysed using the three methods for calculating the HI, which included 35 153 anti-clockwise loops, 11 clockwise loops, 12 figure-of-eight loops which were mainly anti-clockwise 154 and, 8 figure-of-eight loops which were mainly clockwise (loop shapes were examined by visual 155 inspection). The peak turbidity during the storms ranged between 10 and 392 NTU (mean = 91 NTU) 156 and the starting values were between 2 and 31 NTU (mean = 8 NTU). Figure 2 shows six example 157 storms (a-f, panel I) from the range of behaviour identified above, each with varying shape and size. 158 Table 1 summarises the number (and percentage) of storms tested which can be adequately 159 represented by the different discharge interval frequencies tested.

160 Figure 2a-f(II) shows the distributions of HI values (using HI_L) measured at only 50% of discharge are 161 often very different from the analyses which measure multiple sections across the loop (H_{LA}) . The 162 more complex the shape of the loop, the more measured sections are needed to represent it 163 adequately. The analysis shows that by using 5% increments of discharge (19 sections), 98% of the 164 storms analysed showed stable distributions and therefore no significant changes were observed 165 when additional increments were included. While including more increments of the loop in the analysis does improve the HI results, it does not solve all of the issues highlighted earlier. Both HI_L 166 167 and HI_{LA} are sensitive to the size of the storm and, as a result, for a similar pattern in hysteresis but a larger magnitude of storm, a comparatively smaller value would be calculated for the index, as 168 169 shown in Figure 1a. This means that the results generated for a series of storms are very difficult to 170 interpret and it is difficult to compare between individual storms and catchments. By normalising 171 the storms as described above and continuing to use the HI_{LA} method, the comparability of the 172 outputs between storms is improved as they are all assessed on the same scale. However, if multiple increments of discharge are included, which has been shown to be beneficial, then effectively each 173 174 of the individual measured sections of the storm need to be normalised, otherwise the problem is 175 reduced but not eradicated. This problem is illustrated in Figure 1c, which shows an example of an 176 idealised and normalised storm where the width of the loop remains constant through most of the 177 storm. However at different quantiles of flow, HI value varies due to the loop gradient, the HI is inflated towards the lower and reduced at higher quantiles of discharge. The HI_{new} was designed to 178 179 overcome this problem. The new index uses the range of turbidity values between the rising and 180 falling limb at each increment of discharge rather than the ratio, thereby directly quantifying the width of the loop. 181

Figure 4 shows how the new index effectively normalises the rising limb and examines the relativebehaviour of the falling limb, thereby identifing the proportion of the storm occurring in a clockwise

or anti-clockwise phase. For this new method to be robust, it is necessary to normalise the data as 184 185 described earler before the analysis. Figure 2a-f(III) show the example storms in their normalised forms. The new index produces a value between -1 and 1, where 0 represents no hysteretic pattern 186 187 and positive values clockwise and negative values, anti-clockwise hysteresis. A figure-of-eight storm 188 will be represented as a weighted average of the intervals of discharge measured when the storm 189 was in a clockwise phase and when it was in an anticlockwise phase. Therefore, for example, if the 190 storm exhibits anti-clockwise behaviour for a large proportion of the storm event the average HI_{new} 191 will produce a negative number. It should be noted that in the unusal case that an exactly 192 symmetrical figure-of-eight storm is presented the index would produce a value of 0, suggesting no 193 hysteresis. Using the HI value in conjuction with loop area will however provide clarification as a 194 storm which has an HI of 0 but a positive loop area has to be a complex loop shape. The advantage 195 with our new technique is that the user can choose to interrogate other output metrics within these 196 results, such as the quantified loop area and the distribution of HI values calculated for each section 197 of the loop in addition to the averaged HI value. By looking at the distribution of values it is simple to 198 identify complex loop shapes such as figure-of-eight (due to both positive and negative values 199 calculated for the various loop sections) and ensures correct interpretation of the HI values. 200 Although we do not explore the advantage of these further analyses here, we suggest they 201 potentially provide a richer analyses of hysteresis dynamics that we aim to explore in future papers.

202 We suggest the new index provides a consistent approach to the core loop characteristics and 203 therefore is more easily interpretable by the user when comparing behaviour between storms or 204 field sites. Figure 2a-f(IV) show the resulting distributions of HI_{new} generated using varying 205 increments of discharge. The analysis shows that the distribution of calculated values was generally 206 more stable compared with the HI_{LA} method and, in many cases, fewer increments of discharge were 207 necessary to produce a statistically stable representation of the storm loop shape (Table 1). The 208 results demonstrate that increasing the increments to every 10% of discharge allowed 95% of storms 209 and using 5% increments allows 100% of storms to be robustly characterised in terms of their loop 210 shape, meaning that the addition of more sections did not significantly alter the distribution of HI 211 results.

212 *4. Conclusions and recommendations*

The concept of using an index to aid the quantification of storm hysteresis has been established for over two decades. However few papers have chosen to use them, perhaps due to the limitations associated with the most common methods. This technical note was designed to test systematically, for the first time, the way that the HI is calculated and to quantify the impact of the chosen method 217 on the results. The analysis has led to a number of recommendations concerning how the HI should 218 be calculated in order to produce results which are both statistically robust and comparable 219 between storms and field sites. This technique is useful when the user's interest is in the relative 220 characteristics of the loop geometries. These recommendations are:

- Storms should be normalised before analysis so that multiple storms can be robustly
 compared.
- 223 2. A range method, such as the new index (HI_{new}) proposed here, should be used in preference
 to a ratio method as it produces results which are easier to interpret, allowing quantification
 of the extent of the hysteresis effect that can be directly compared between contrasting
 catchments even when the magnitude of the storms varies greatly.
- Multiple sections of each loop should be analysed so that the extent and direction of the
 hysteresis can be accounted for throughout the flow range. Sections should be measured at
 least every 10% of the discharge range, although every 5% is recommended as it is likely,
 based on our analysis, to produce robust results for almost all storm sizes and shapes.
- 4. Examine the distribution of HI values calculated across the sections in addition to the
 averaged value, as this aids robust classification of complex loop shapes, including figure-ofeight loops.

Undertaking the analysis of hysteresis loops using these guidelines improves the clarity of the 234 235 hysteresis index as a diagnostic tool for the analysis of storms and how discharge-concentration patterns vary. The new index (HI_{new}) is able to describe robustly the shape and direction of a 236 237 hysteretic pattern in storms of any size, and can be used to compare storms from multiple 238 catchments. This means that the index becomes more useful as it has the potential to become a 239 standardised analytical technique that can be utilised by the water quality research community. 240 Lloyd et al. (2016) illustrates the use of the new hysteresis index to investigate storm behaviours 241 across different nutrient parameters and between contrasting catchments. This study exemplifies 242 the power of having such a summary statistic, as different parameters and field sites can be rapidly 243 and robustly compared. The information provided by the HI_{new} can be used in conjuction with other common metrics such as storm maximum concentration to produce a useful and robust quantitative 244 245 representation of storm hydrochemical behaviour. Standardising approaches for the calculation of 246 HI would provide a useful tool for assessing storm behaviour. This is timely given the marked 247 increase in the number of catchment scale water quality monitoring initiatives, which are now 248 employing high temporal resolution monitoring to improve understanding of pollution sources and 249 delivery pathways. Our ongoing research is exploring the use of this new index in understanding 250 changing catchment dynamics associated with storm behaviours.

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257 Table 1: showing the increments of discharge measured and the corresponding number of storms

258 (out of 66 analysed) and the percentage of storms which can be robustly* characterised using

259 different HI methods. *Where adding extra measurement sections does not statistically change the

260 distribution of HI vales for a storm.

Percentile	Sections	Storms	Storms
increments	measured	(HI∟⁄HI _{LA})	(HI _{new})
50%	1	5 (8%)	1 (1.5%)
25%	3	34 (52%)	41 (62%)
10%	9	55 (83%)	63 (95%)
5%	19	65 (98%)	66 (100%)
1%	99	66 (100%)	66 (100%)

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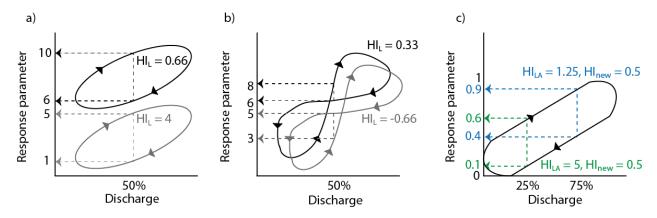


Figure 1: Plots showing a) impact of storm initial concentration, b) storm initial discharge on the value of the calculated HI when the mid-point in discharge and raw data is used and c) an idealised

- and normalised storm illustrating the impact of measuring different quantiles of flow on the HI
 calculated. Where HI_L and HI_{LA} are the original and adapted Lawler et al. (2006) methods,
- respectively and HI_{new}, the proposed new method. Colours represent different discharge intervals
- 358 measured.

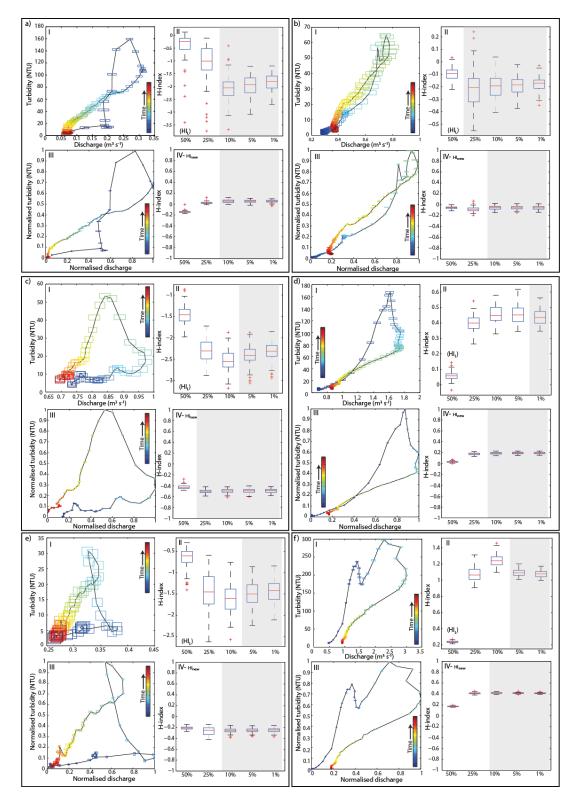


Figure 2: Plots showing six storms with varying loop shapes and sizes (a-f), where (I) is the hysteresis loop using the raw data, (II) is the distribution of HI values using the original and adapted Lawler et al. (2006) methods (HI_L/HI_{LA}) using varying percentiles of flow, (III) is the hysteresis loop plotted using normalised data, and (IV) is the distribution of HI values using the new method (HI_{new}) using varying percentiles of flow. The grey areas show the distributions which are not statistically different from each other. In panels I and III, the black line represents the median and the boxes represent the 5th-95th percentiles of the uncertainty range.

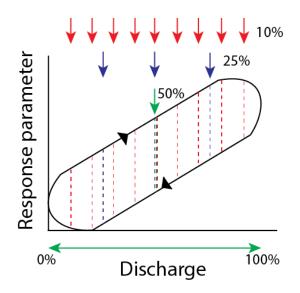
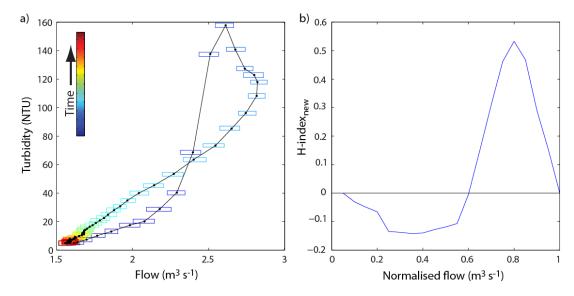


Figure 3: diagram showing examples of how the sampling intervals for the calculation of the HI_{LA} and
 HI_{new} are determined.



372 Figure 4: showing a) the original storm, where the black line represents the median and the boxes

the 5th-95th percentiles of the uncertainty around the line, and b) illustrates the HI_{new} of the
 normalised storm.