Transit Time Theory is not what it used to be

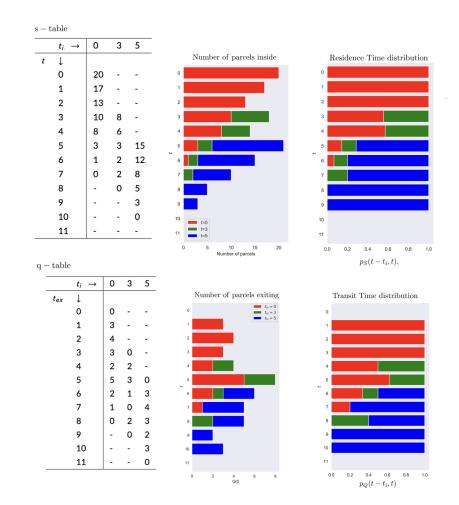
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January 24, 2023

Abstract

The understating of the dynamics of tracers and water transit times at catchment scale has increasingly grown in the last decades, becoming a consolidated approach in the field of hydrological and ecohydrological research. Recently, a benchmark contribution has been given in the work by Benettin et al. (2022), which reviews the state of art on the topic, also addressing present and future challenge, pointing out some open questions in transit time research. This commentary tries to contextualize the above article, highlighting the most focal points and relating it to a broader context in the field. A brief overview on the main concepts of backward transit times, StorAge selection functions and forward transit time distributions is given in a logical-historical order, giving to the reader the primary instruments for a later comprehensive understating of the Transit Time Theory. Eventually, a numerical example helps to clarify the above concepts in a very simple and effective way.



Transit Time Theory is not what it used to be

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Key Points:

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8	• Time variant Transit Time Theories (T3) are becoming more important in the hy-
9	drological studies.
10	• By using T3 tracer and isotope dynamics can be completely understood.
11	• Transit Time and Residence Time can be effectively connected by StorAge Selec-
12	tion functions (SAS)
13	• Transit Time and Residence Time distributions are connected by Niemi's iden-

Transit Time and Residence Time distributions are connected by Niemi's iden tity when one is affected by celerities the other is also.

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15 Abstract

The understanding of the dynamics of tracers and water transit times at catchment 16 scale has increasingly grown in the last decade, becoming a consolidated approach in the 17 field of hydrological and ecohydrological research. Recently, a benchmark contribution 18 was made in the work by Benettin et al. (2022), which reviews the state of the art on 19 the topic, addresses present and future challenges, and points out some open questions 20 in transit time research. This commentary tries to contextualize the aforementioned ar-21 ticle, highlighting its most focal points, and relating it to a broader context in the field. 22 23 A brief overview of the main concepts of backward transit times, StorAge selection functions and forward transit time distributions is given in a logical-historical order, provid-24 ing the reader with the primary instruments needed for a comprehensive understand-25 ing of Transit Time Theory (T3). Finally, a numerical example helps to clarify the above 26 concepts in a very simple and effective way. 27

28 1 Introduction

Is the mathematical description of the dynamics of tracers and water *transit times* 20 (TT) at catchment scale completely understood? The recent contribution by Benettin 30 et al. (2022) gives a comprehensive review of the topic, which summarizes the state of 31 the art. With T3 representing the most consistent ways to build statistical mechanics 32 of water movements in catchments, now supported by the increasing availability of mea-33 surements made with isotopes, Benettin et al. (2022) is a timely and welcome contribu-34 tion. T3 have followed two converging pathways, one coming from the works on chem-35 ical reactions and mixing of the late sixties, (e.g., Nauman, 1969), and the other cross-36 ing the history of the geomorphological instantaneous unit hydrograph, GIUH, (Rodriguez-37 Iturbe & Valdes, 1979; Rigon, Bancheri, Formetta, & de Lavenne, 2016). Both paths use 38 the concept of "times distributions" but in different ways. When dealing with tracers 39 or chemicals, we are looking at the histories of water parcels (ideal groups of water and 40 molecules of solutes that move together across a control volume) since their injection into 41 the control volume. Whereas when it comes to the GIUH, we are guessing what will be 42 the hydrologic response in the future. 43

⁴⁴ 2 Backward transit (travel) times

Let us imagine an observer who, sitting at the outlet(s) of a control volume, records 45 the composition of water and solute exiting the control volume at any time step and an-46 alyzes the age distribution by means of the presence of isotopes (Klaus & McDonnell, 47 2013). This distribution is called *backward transit time distribution* (BTTD) and has been 48 variably indicated in literature as $\overleftarrow{p}_Q(T,t)$ or $p_Q(t-t_i|t)$ or $p_Q(T,t)$. We will use the 49 last notation, as in Benettin et al. (2022), even though the conditional nature of these 50 probabilities (Botter et al., 2010; Rigon, Bancheri, & Green, 2016) would suggest that 51 the second notation is more rigorous and informative. $T := t - t_i$ is the transit time, 52 t_i is the precipitation (injection) time, while for the observer at the outlet the current 53 time t is the exit time, t_{ex} , by definition. In the most general case BTTD vary from time 54 to time, i.e. they are *time-variant*, due to the complexity of the internal paths in the con-55 trol volumes; this is shown in Fig. 1, where each row of the q-table identifies a different 56 distribution. Time invariant BTTD can be caused either by a stationary velocity field 57 or when the heterogeneity of the control volume is so high that complete randomness 58 dominates the system (Dooge, 1986). However, stationarity is a rare case that in hydro-59 logical contexts can be altered quite simply with the injection of new water, as estab-60 lished by the laws of water and solute dynamics in all known media. Randomness, on 61 the other hand, is arguably more common, especially when water flows across soil and 62 aquifers (Dagan, 1986). 63

Recent studies on catchment dynamics (Durighetto & Botter, 2022) establish that 64 catchments do indeed tend to have defined behaviours that repeat in the same way un-65 der similar forcing conditions. This suggests that transit times can vary with the inten-66 sity of precipitation and droughts but are repeated similarly in the same catchment when 67 the same conditions are verified, as previously modelled by Godsey and Kirchner (2014). 68 Any variation of the velocities field in the control volume must logically be attributed 69 to hydraulic head changes that propagate pressure waves, i.e. celerities (McDonnell & 70 Beven, 2014). Historically, given the gap between what can be theorized and what can 71 be measured and discriminated in the field, BTTD were modelled using time indepen-72 dent transit times distributions (Maloszewski & Zuber, 1996; McGuire & McDonnell, 2006). 73 which can be understood as an overall mean behaviour of the system through time. 74

A complementary approach to the one just described that uses distributions was generated in literature by categorizing the water age as "old" and "new" and analyzing their ratio. This was deemed more appropriate to the discrimination capabilities of current field surveys and measurements (Kirchner, 2019) and, given its relatively modest data requirements, has emerged as a tool to quantify the fraction of water moving through the catchment on time scales of hours, days, or weeks (Benettin et al., 2022).

3 StorAge Selection Functions

Differently from what was believed in the past, the age distribution of parcels inside the catchment, called *Backward Residence Time Distribution* (BRTD), is different from the the BTTD. This can be grasped with a simple example, (e.g., Rigon, Bancheri, & Green, 2016), illustrated in Figure 1 and comparing the BRTD toys distributions on top right with the BTTD distribution on the bottom right.

Analogously to the BTTD, the BRTD has been indicated in literature as $p_S(T,t)$ or $p_S(t-t_i|t)$ or $p_S(T,t)$ but we will use the last notation as in Benettin et al. (2022). As shown in the pioneering work of Botter et al. (2010, 2011), the two distributions can be related through some physical-hydrological hypotheses, leading to a group of solutions for the dynamics of water. The functions relating the BTTD and the BRTD were named StorAge Selection functions (Rinaldo et al., 2015; Harman, 2015) or SAS. It can be defined as:

$$\omega_Q(T,t) := \frac{p_Q(T,t)}{p_S(T,t)} \tag{1}$$

where ':=' means "is defined as", $\omega_Q(T,t)$ is the notation for SAS and the probabilities 94 on the right-hand side were defined previously. The conceptual meaning of SAS can be 95 easily grasped considering that them correspond to the rules with which the water parcels 96 inside a control volume are selected by hydrological dynamics to exit it; the water parcels 97 are eventually recorded at the outlets. The simplest SAS, the identity $\omega_Q = 1$, corre-98 sponds to the uniform selection of water parcels from the population of water parcels in 99 the control volume, without favouring a particular subset of ages. In this case BTTD 100 and BRTD coincide and the form of the BTTD is known simply by solving the water 101 budget (Botter et al., 2011): 102

$$p_Q(T,t) = \frac{J(t_i)}{S(t_i)} e^{-\int_{t-T}^t \frac{J(x)}{S(x)} dx}$$
(2)

where J(x) is the precipitation input at time x and S(x) is the total volume of water stored in the control volume at time x. Equation (2) is a solution that generalizes the results of Nauman (1969), which is further generalized in Botter et al. (2011). Benettin et al. (2022) provides an accurate review on how the SAS is obtained and characterized against measurements. Notably, the most recent assessment technique to obtain it is to assign the so-called cumulative SAS, $\Omega_Q(T, t)$, which is equivalent to the cumulative transit time

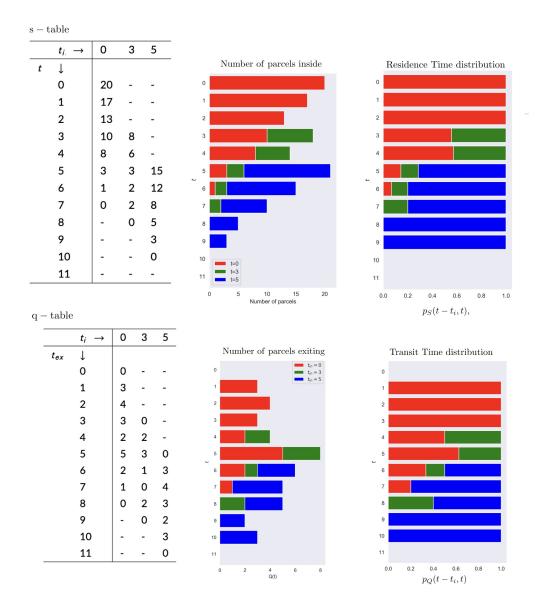


Figure 1. The figure represents the hypothetical set of water parcels of a control volume (top left table, or s-table) and the corresponding discharges (bottom left table, or q-table). The central column represents, respectively, at the top, the number of water parcels inside the control volume and, at the bottom, the number of water parcel exiting the control volume. The different colours represent rainfall injected at different injection times and, at any time t, the bars reflect the age composition of the storage (top center) and discharge (bottom center). On the right column the total number of parcels, both for resident and exiting parcels, are normalized to 1, thus representing the backward residence time probability distribution and the backward transit time probability distribution (top and bottom respectively). The Figure also reveals the discrete nature of these distributions. Further comments are in the text.

distribution function between [0,T]. That is to say:

$$\Omega_Q(T,t) := \int_{t-T}^t p_Q(t-t_i|t) dt_i = \int_{t-T}^t \omega_Q(t,t_i) p_S(t-t_i|t) dt_i = \int_0^{p_S(T|t)} \omega_Q(P_S,t) dP_S$$
(3)

¹¹⁰ Usually, $\Omega_Q(T, t)$ is written as $\Omega_Q(S_T(T, t), t)$ to highlight that the dependence of Ω_Q ¹¹¹ on t_i is mediated by a dependence on the cumulative storage S_T , defined as the total vol-¹¹² ume of storage of parcels whose age is between [0,T]. As shown in Benettin et al. (2022), ¹¹³ the literature has provided various forms for the $\Omega_Q(T, t)$ function, which have given ex-¹¹⁴ cellent results in analyzing field cases. Finding ways to assign Ω or related quantities is ¹¹⁵ one key aspect to which Benettin et al. (2022) offers a valuable review.

116 A typical example of Ω , for instance, can be:

$$\Omega_Q(P_S) = P_S^k \tag{4}$$

where P_S is the probability associated with the BRTD and k is a parameter that favours the selection of young water if less than 1 and of old water if greater than 1 (Benettin et al., 2017; Harman, 2019).

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¹²⁰ 4 Forward transit time distribution (a.k.a. the Hydrologic response) ¹²¹ and Niemi's identity

It has been known since the seventies that BTTD do not coincide with the forward 122 transit time distributions (Niemi, 1977). The latter are usually thought of as hypothe-123 ses on the life expectancy of the population of water parcels injected into a control vol-124 ume at a given input time (Rigon & Bancheri, 2021) and can be identified with a gen-125 eralization of the integral operator traditionally known as instantaneous unit hydrograph, 126 $IUH(T|t_i)$, made time varying. This restricted life expectancy is, by construction, con-127 ditional on the injection, i.e., on the precipitation time. The number of IUHs is discrete 128 and numerable, while the IUHs themselves are continuous functions of t. In Figure 1, 129 each columns of the q-table is an IUH, normalized by the total amount of precipitation 130 at time t_i , i.e., the first (non null) entry of the same column in the s-table. Niemi's iden-131 tity thus reads: 132

$$IUH(T|t_i)J(t_i) \equiv p_Q(T, t_i)Q(t) \tag{5}$$

where IUH is the travel time distribution, J is the precipitation, and Q(t) is the dis-133 charge. More complex expressions need to be used if the water parcels can exit the con-134 trol volume in other ways, for instance as transpiration, besides as surface runoff. The 135 identity can be misleading because it is often unclear to the reader that it cannot be used 136 to forecast the future (i.e., the IUH) from the past (i.e., using the BTTD) unless some 137 hypothesis of time invariance is made. This part is not explicitly treated in Benettin et 138 al. (2022) but can be found in Rigon, Bancheri, and Green (2016) and Rigon and Bancheri 139 (2021).140

Niemi's identity is a powerful machine to extract knowledge from the past, prob-141 ably as powerful as the Bayes formula, even if it has not been exploited enough so far. 142 For any time t, in fact, all the past IUHs, each one corresponding to a different precip-143 itation time, can be obtained and the whole sequence used to explore its variability. In 144 principle, some water parcels can take infinite time to exit the control volume. However, 145 in practice, after a reasonable characteristic time, only an irrelevant part of what was 146 injected has still to exit, for example an arbitrary portion of 0.001, and can be neglected 147 for all practical purposes. This arbitrary choice would identify, in the old parlance of IUH148 theory, the concentration time of a particular catchment under its specific climate his-149 tory. 150

¹⁵¹ Niemi's identity, on the other hand, shows that if the BTTD are affected by celer-¹⁵² ity then so should the hydrologic response be.

¹⁵³ 5 The Swiss Army knife for understanding

The Swiss Army knife for understanding all of the above relationships is given by the decomposition of both the backward and forward probabilities in terms of the ageranked discharges (van der Velde et al., 2012; Benettin et al., 2013; Harman, 2019), which are actually the functions tabulated in Figure 1. The s-table in the figure is a discrete representation of the age-ranked storage, $s(t, t_i)$, for which:

$$S(t) = \sum_{\forall t_i} s(t, t_i) \tag{6}$$

where S(t) is the total water present in the control volume. The age ranked discharges, 159 $q(t,t_i)$, are represented in the q-table and for them a relation similar to equation (6) is 160 valid. They represent the decomposition of a given discharge according to the ages that 161 compose it (or, which is equivalent, the precipitation time). All the details of these de-162 composition can be found, for instance, in Rigon, Bancheri, and Green (2016). Here we 163 give a brief compendium based on Figure 1 where the entries of the q-table are the age-164 ranked discharge recorded at discrete times. If we focus just on new water and old wa-165 ter, these can be obtained by separating the columns of the q-table in the figure into two 166 groups, before and after a certain date t_i (included), and the columns entries summed 167 together. 168

The use of age-ranked functions not only makes Niemi's identity trivial, corresponding to the intersection of a given column (from which the *IUH* is obtained) and a given row (from which the BTTD is obtained) in the q-table, but also suggests easy numerical methods for the computation of any of the quantities presented in the previous descriptions.

6 Conclusions

The result of the above findings, well described in Benettin et al. (2022), is that 175 in recent years a great number of papers have embraced the new insights for investigat-176 ing how water moves in hillslopes, either using the approach shown in Kirchner (2019) 177 or the SAS approach. Using process-based approaches, database approaches and their 178 variations (Meira Neto et al., 2022), it has been possible to determine that transport mech-179 anisms vary greatly between wet and dry periods, due to the interplay of surface runoff, 180 soil flow and groundwater contribution (Soulsby et al., 2015; Tetzlaff et al., 2014; Wilusz 181 et al., 2017; von Freyberg et al., 2017; Knapp et al., 2019). Various papers, as reported 182 in Benettin et al. (2022), have described the mechanism of activation of flows of old wa-183 ter and the impact of new precipitation. 184

Besides, the indications derived from the new T3 approaches are also affecting the way catchments are modelled. Because it has been shown that to any model structure there corresponds a travel time signature (Rigon & Bancheri, 2021), the model-used-ashypothesis approach (Clark et al., 2011; Beven, 2018) has acquired new tools to be exploited.

As emphasized in the last sections of Benettin et al. (2022), using T3 allows for more than just predicting discharges of water and solutes. It opens new directions for the investigation of the whole hydrological cycle (McDonnell, 2014), especially in assessing how vegetation uses water of different ages.

Eventually, these and others new challenges are carefully reviewed in Benettin et al. (2022) opening up, as Li et al. (2021) states, to the development of integrated Earth system science theories at the intersection of hydrology, biology and geochemistry, following the call for understanding of climate-soil-vegetation dynamics that started with Rodriguez-Iturbe (2000).

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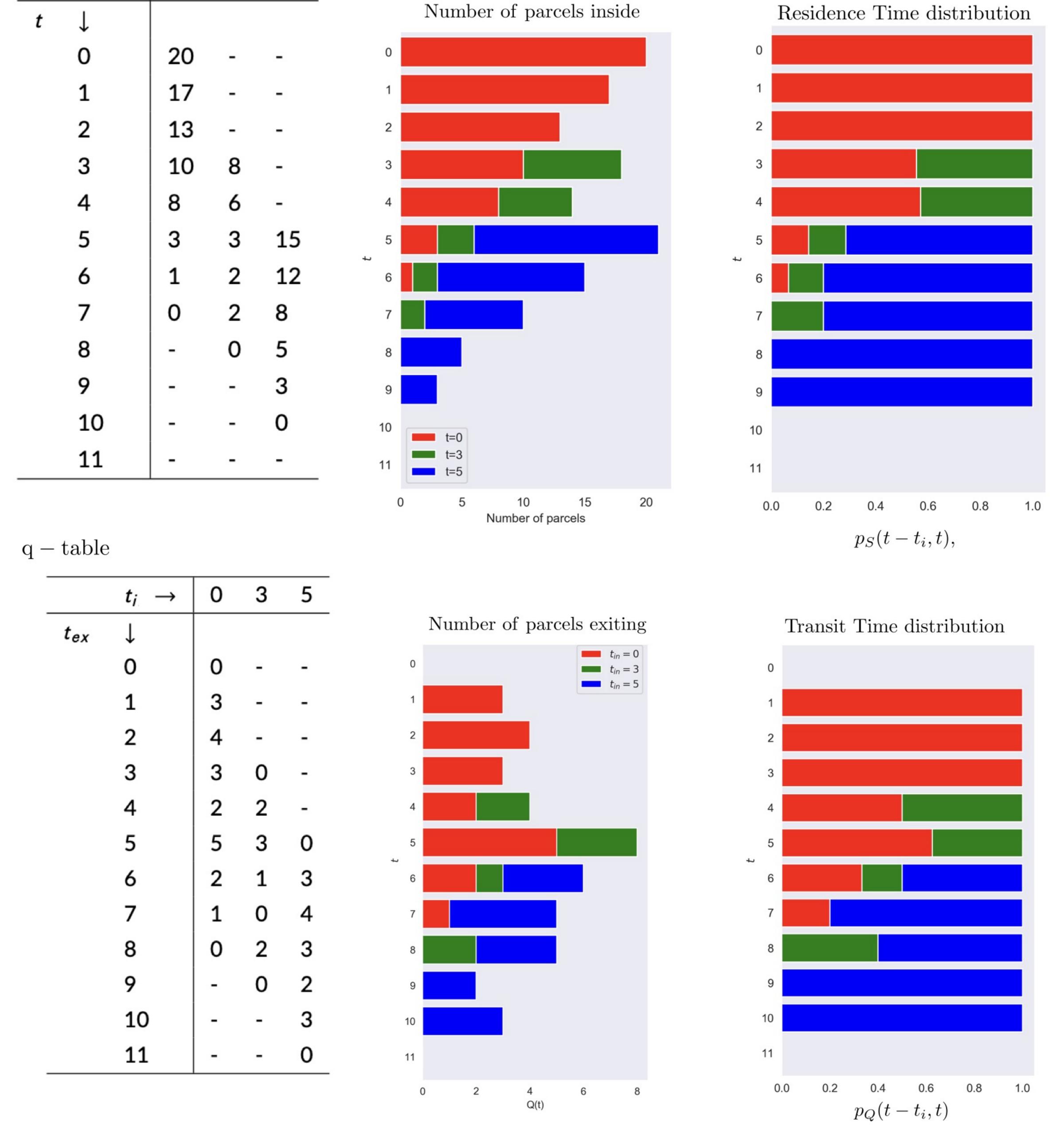
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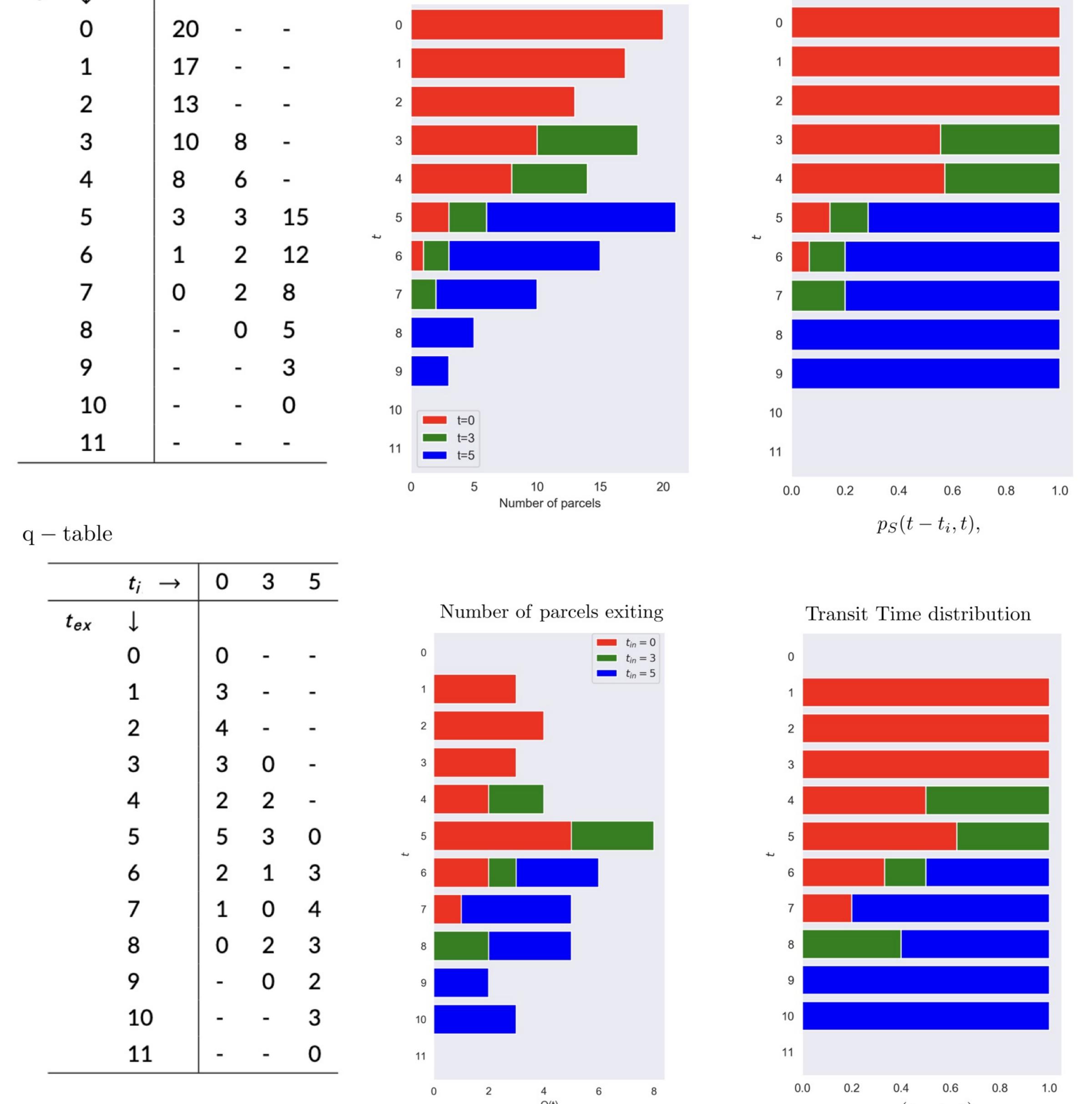
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Figure.

s-table

	$t_i \rightarrow$	0	3	5
t	\downarrow			
	0	20	-	-
	1	17	-	-
	2	13	-	-
	3	10	8	-
	4	8	6	-
	5	3	3	15
	6	1	2	12
	7	0	2	8
	8	-	0	5
	9	-	-	3
	10	-	-	0





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28 1 Introduction

Is the mathematical description of the dynamics of tracers and water *transit times* 20 (TT) at catchment scale completely understood? The recent contribution by Benettin 30 et al. (2022) gives a comprehensive review of the topic, which summarizes the state of 31 the art. With T3 representing the most consistent ways to build statistical mechanics 32 of water movements in catchments, now supported by the increasing availability of mea-33 surements made with isotopes, Benettin et al. (2022) is a timely and welcome contribu-34 tion. T3 have followed two converging pathways, one coming from the works on chem-35 ical reactions and mixing of the late sixties, (e.g., Nauman, 1969), and the other cross-36 ing the history of the geomorphological instantaneous unit hydrograph, GIUH, (Rodriguez-37 Iturbe & Valdes, 1979; Rigon, Bancheri, Formetta, & de Lavenne, 2016). Both paths use 38 the concept of "times distributions" but in different ways. When dealing with tracers 39 or chemicals, we are looking at the histories of water parcels (ideal groups of water and 40 molecules of solutes that move together across a control volume) since their injection into 41 the control volume. Whereas when it comes to the GIUH, we are guessing what will be 42 the hydrologic response in the future. 43

⁴⁴ 2 Backward transit (travel) times

Let us imagine an observer who, sitting at the outlet(s) of a control volume, records 45 the composition of water and solute exiting the control volume at any time step and an-46 alyzes the age distribution by means of the presence of isotopes (Klaus & McDonnell, 47 2013). This distribution is called *backward transit time distribution* (BTTD) and has been 48 variably indicated in literature as $\overleftarrow{p}_Q(T,t)$ or $p_Q(t-t_i|t)$ or $p_Q(T,t)$. We will use the 49 last notation, as in Benettin et al. (2022), even though the conditional nature of these 50 probabilities (Botter et al., 2010; Rigon, Bancheri, & Green, 2016) would suggest that 51 the second notation is more rigorous and informative. $T := t - t_i$ is the transit time, 52 t_i is the precipitation (injection) time, while for the observer at the outlet the current 53 time t is the exit time, t_{ex} , by definition. In the most general case BTTD vary from time 54 to time, i.e. they are *time-variant*, due to the complexity of the internal paths in the con-55 trol volumes; this is shown in Fig. 1, where each row of the q-table identifies a different 56 distribution. Time invariant BTTD can be caused either by a stationary velocity field 57 or when the heterogeneity of the control volume is so high that complete randomness 58 dominates the system (Dooge, 1986). However, stationarity is a rare case that in hydro-59 logical contexts can be altered quite simply with the injection of new water, as estab-60 lished by the laws of water and solute dynamics in all known media. Randomness, on 61 the other hand, is arguably more common, especially when water flows across soil and 62 aquifers (Dagan, 1986). 63

Recent studies on catchment dynamics (Durighetto & Botter, 2022) establish that 64 catchments do indeed tend to have defined behaviours that repeat in the same way un-65 der similar forcing conditions. This suggests that transit times can vary with the inten-66 sity of precipitation and droughts but are repeated similarly in the same catchment when 67 the same conditions are verified, as previously modelled by Godsey and Kirchner (2014). 68 Any variation of the velocities field in the control volume must logically be attributed 69 to hydraulic head changes that propagate pressure waves, i.e. celerities (McDonnell & 70 Beven, 2014). Historically, given the gap between what can be theorized and what can 71 be measured and discriminated in the field, BTTD were modelled using time indepen-72 dent transit times distributions (Maloszewski & Zuber, 1996; McGuire & McDonnell, 2006). 73 which can be understood as an overall mean behaviour of the system through time. 74

A complementary approach to the one just described that uses distributions was generated in literature by categorizing the water age as "old" and "new" and analyzing their ratio. This was deemed more appropriate to the discrimination capabilities of current field surveys and measurements (Kirchner, 2019) and, given its relatively modest data requirements, has emerged as a tool to quantify the fraction of water moving through the catchment on time scales of hours, days, or weeks (Benettin et al., 2022).

3 StorAge Selection Functions

Differently from what was believed in the past, the age distribution of parcels inside the catchment, called *Backward Residence Time Distribution* (BRTD), is different from the the BTTD. This can be grasped with a simple example, (e.g., Rigon, Bancheri, & Green, 2016), illustrated in Figure 1 and comparing the BRTD toys distributions on top right with the BTTD distribution on the bottom right.

Analogously to the BTTD, the BRTD has been indicated in literature as $p_S(T,t)$ or $p_S(t-t_i|t)$ or $p_S(T,t)$ but we will use the last notation as in Benettin et al. (2022). As shown in the pioneering work of Botter et al. (2010, 2011), the two distributions can be related through some physical-hydrological hypotheses, leading to a group of solutions for the dynamics of water. The functions relating the BTTD and the BRTD were named StorAge Selection functions (Rinaldo et al., 2015; Harman, 2015) or SAS. It can be defined as:

$$\omega_Q(T,t) := \frac{p_Q(T,t)}{p_S(T,t)} \tag{1}$$

where ':=' means "is defined as", $\omega_Q(T,t)$ is the notation for SAS and the probabilities 94 on the right-hand side were defined previously. The conceptual meaning of SAS can be 95 easily grasped considering that them correspond to the rules with which the water parcels 96 inside a control volume are selected by hydrological dynamics to exit it; the water parcels 97 are eventually recorded at the outlets. The simplest SAS, the identity $\omega_Q = 1$, corre-98 sponds to the uniform selection of water parcels from the population of water parcels in 99 the control volume, without favouring a particular subset of ages. In this case BTTD 100 and BRTD coincide and the form of the BTTD is known simply by solving the water 101 budget (Botter et al., 2011): 102

$$p_Q(T,t) = \frac{J(t_i)}{S(t_i)} e^{-\int_{t-T}^t \frac{J(x)}{S(x)} dx}$$
(2)

where J(x) is the precipitation input at time x and S(x) is the total volume of water stored in the control volume at time x. Equation (2) is a solution that generalizes the results of Nauman (1969), which is further generalized in Botter et al. (2011). Benettin et al. (2022) provides an accurate review on how the SAS is obtained and characterized against measurements. Notably, the most recent assessment technique to obtain it is to assign the so-called cumulative SAS, $\Omega_Q(T, t)$, which is equivalent to the cumulative transit time

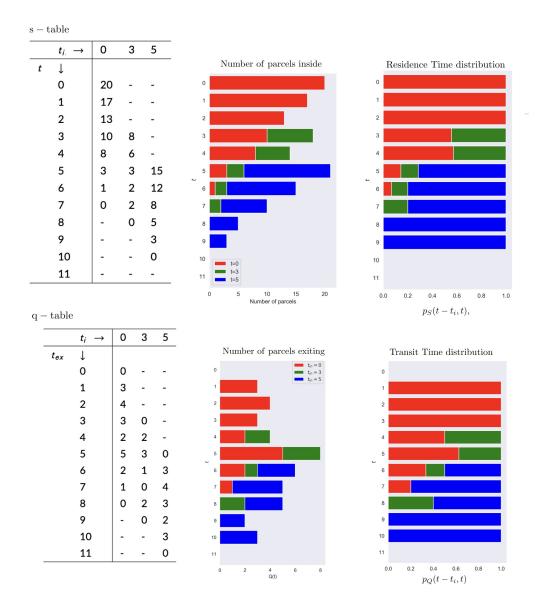


Figure 1. The figure represents the hypothetical set of water parcels of a control volume (top left table, or s-table) and the corresponding discharges (bottom left table, or q-table). The central column represents, respectively, at the top, the number of water parcels inside the control volume and, at the bottom, the number of water parcel exiting the control volume. The different colours represent rainfall injected at different injection times and, at any time t, the bars reflect the age composition of the storage (top center) and discharge (bottom center). On the right column the total number of parcels, both for resident and exiting parcels, are normalized to 1, thus representing the backward residence time probability distribution and the backward transit time probability distribution (top and bottom respectively). The Figure also reveals the discrete nature of these distributions. Further comments are in the text.

distribution function between [0,T]. That is to say:

$$\Omega_Q(T,t) := \int_{t-T}^t p_Q(t-t_i|t) dt_i = \int_{t-T}^t \omega_Q(t,t_i) p_S(t-t_i|t) dt_i = \int_0^{p_S(T|t)} \omega_Q(P_S,t) dP_S$$
(3)

¹¹⁰ Usually, $\Omega_Q(T, t)$ is written as $\Omega_Q(S_T(T, t), t)$ to highlight that the dependence of Ω_Q ¹¹¹ on t_i is mediated by a dependence on the cumulative storage S_T , defined as the total vol-¹¹² ume of storage of parcels whose age is between [0,T]. As shown in Benettin et al. (2022), ¹¹³ the literature has provided various forms for the $\Omega_Q(T, t)$ function, which have given ex-¹¹⁴ cellent results in analyzing field cases. Finding ways to assign Ω or related quantities is ¹¹⁵ one key aspect to which Benettin et al. (2022) offers a valuable review.

116 A typical example of Ω , for instance, can be:

$$\Omega_Q(P_S) = P_S^k \tag{4}$$

where P_S is the probability associated with the BRTD and k is a parameter that favours the selection of young water if less than 1 and of old water if greater than 1 (Benettin et al., 2017; Harman, 2019).

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¹²⁰ 4 Forward transit time distribution (a.k.a. the Hydrologic response) ¹²¹ and Niemi's identity

It has been known since the seventies that BTTD do not coincide with the forward 122 transit time distributions (Niemi, 1977). The latter are usually thought of as hypothe-123 ses on the life expectancy of the population of water parcels injected into a control vol-124 ume at a given input time (Rigon & Bancheri, 2021) and can be identified with a gen-125 eralization of the integral operator traditionally known as instantaneous unit hydrograph, 126 $IUH(T|t_i)$, made time varying. This restricted life expectancy is, by construction, con-127 ditional on the injection, i.e., on the precipitation time. The number of IUHs is discrete 128 and numerable, while the IUHs themselves are continuous functions of t. In Figure 1, 129 each columns of the q-table is an IUH, normalized by the total amount of precipitation 130 at time t_i , i.e., the first (non null) entry of the same column in the s-table. Niemi's iden-131 tity thus reads: 132

$$IUH(T|t_i)J(t_i) \equiv p_Q(T, t_i)Q(t) \tag{5}$$

where IUH is the travel time distribution, J is the precipitation, and Q(t) is the dis-133 charge. More complex expressions need to be used if the water parcels can exit the con-134 trol volume in other ways, for instance as transpiration, besides as surface runoff. The 135 identity can be misleading because it is often unclear to the reader that it cannot be used 136 to forecast the future (i.e., the IUH) from the past (i.e., using the BTTD) unless some 137 hypothesis of time invariance is made. This part is not explicitly treated in Benettin et 138 al. (2022) but can be found in Rigon, Bancheri, and Green (2016) and Rigon and Bancheri 139 (2021).140

Niemi's identity is a powerful machine to extract knowledge from the past, prob-141 ably as powerful as the Bayes formula, even if it has not been exploited enough so far. 142 For any time t, in fact, all the past IUHs, each one corresponding to a different precip-143 itation time, can be obtained and the whole sequence used to explore its variability. In 144 principle, some water parcels can take infinite time to exit the control volume. However, 145 in practice, after a reasonable characteristic time, only an irrelevant part of what was 146 injected has still to exit, for example an arbitrary portion of 0.001, and can be neglected 147 for all practical purposes. This arbitrary choice would identify, in the old parlance of IUH148 theory, the concentration time of a particular catchment under its specific climate his-149 tory. 150

¹⁵¹ Niemi's identity, on the other hand, shows that if the BTTD are affected by celer-¹⁵² ity then so should the hydrologic response be.

¹⁵³ 5 The Swiss Army knife for understanding

The Swiss Army knife for understanding all of the above relationships is given by the decomposition of both the backward and forward probabilities in terms of the ageranked discharges (van der Velde et al., 2012; Benettin et al., 2013; Harman, 2019), which are actually the functions tabulated in Figure 1. The s-table in the figure is a discrete representation of the age-ranked storage, $s(t, t_i)$, for which:

$$S(t) = \sum_{\forall t_i} s(t, t_i) \tag{6}$$

where S(t) is the total water present in the control volume. The age ranked discharges, 159 $q(t,t_i)$, are represented in the q-table and for them a relation similar to equation (6) is 160 valid. They represent the decomposition of a given discharge according to the ages that 161 compose it (or, which is equivalent, the precipitation time). All the details of these de-162 composition can be found, for instance, in Rigon, Bancheri, and Green (2016). Here we 163 give a brief compendium based on Figure 1 where the entries of the q-table are the age-164 ranked discharge recorded at discrete times. If we focus just on new water and old wa-165 ter, these can be obtained by separating the columns of the q-table in the figure into two 166 groups, before and after a certain date t_i (included), and the columns entries summed 167 together. 168

The use of age-ranked functions not only makes Niemi's identity trivial, corresponding to the intersection of a given column (from which the *IUH* is obtained) and a given row (from which the BTTD is obtained) in the q-table, but also suggests easy numerical methods for the computation of any of the quantities presented in the previous descriptions.

6 Conclusions

The result of the above findings, well described in Benettin et al. (2022), is that 175 in recent years a great number of papers have embraced the new insights for investigat-176 ing how water moves in hillslopes, either using the approach shown in Kirchner (2019) 177 or the SAS approach. Using process-based approaches, database approaches and their 178 variations (Meira Neto et al., 2022), it has been possible to determine that transport mech-179 anisms vary greatly between wet and dry periods, due to the interplay of surface runoff, 180 soil flow and groundwater contribution (Soulsby et al., 2015; Tetzlaff et al., 2014; Wilusz 181 et al., 2017; von Freyberg et al., 2017; Knapp et al., 2019). Various papers, as reported 182 in Benettin et al. (2022), have described the mechanism of activation of flows of old wa-183 ter and the impact of new precipitation. 184

Besides, the indications derived from the new T3 approaches are also affecting the way catchments are modelled. Because it has been shown that to any model structure there corresponds a travel time signature (Rigon & Bancheri, 2021), the model-used-ashypothesis approach (Clark et al., 2011; Beven, 2018) has acquired new tools to be exploited.

As emphasized in the last sections of Benettin et al. (2022), using T3 allows for more than just predicting discharges of water and solutes. It opens new directions for the investigation of the whole hydrological cycle (McDonnell, 2014), especially in assessing how vegetation uses water of different ages.

Eventually, these and others new challenges are carefully reviewed in Benettin et al. (2022) opening up, as Li et al. (2021) states, to the development of integrated Earth system science theories at the intersection of hydrology, biology and geochemistry, following the call for understanding of climate-soil-vegetation dynamics that started with Rodriguez-Iturbe (2000).

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