### Benthic biolayer structure controls whole-stream reactive transport

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#### Abstract

Hyporheic zone reaction rates are highest just below the sediment-water interface, in a shallow region called the benchic biolayer. Vertical variability of hyporheic reaction rates leads to unexpected reaction kinetics for stream-borne solutes, compared to classical model predictions. We show that deeper, low-reactivity locations within the hyporheic zone retain solutes for extended periods, which delays reactions and causes solutes to persist at higher concentrations in the stream reach than would be predicted by classical approaches. These behaviors are captured by an upscaled model that reveals the fundamental physical and chemical processes in the hyporheic zone. We show how time scales of transport and reaction within the biolayer control solute retention and transformation at the stream scale, and we demonstrate that accurate assessment of stream-scale reactivity requires methods that integrate over all travel times.

# Benthic biolayer structure controls whole-stream reactive transport

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#### **s** Key Points:

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9	•	Storage in non-reactive sublayer causes long contaminant survival times
10	•	Reach-scale reaction kinetics cannot be captured by constant rate model

• Upscaled model quantifies all aspects of reaction and mass transfer

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#### 12 Abstract

Hyporheic zone reaction rates are highest just below the sediment-water interface, in a 13 shallow region called the benthic biolayer. Vertical variability of hyporheic reaction rates 14 leads to unexpected reaction kinetics for stream-borne solutes, compared to classical model 15 predictions. We show that deeper, low-reactivity locations within the hyporheic zone re-16 tain solutes for extended periods, which delays reactions and causes solutes to persist 17 at higher concentrations in the stream reach than would be predicted by classical ap-18 proaches. These behaviors are captured by an upscaled model that reveals the funda-19 mental physical and chemical processes in the hyporheic zone. We show how time scales 20 of transport and reaction within the biolayer control solute retention and transforma-21 tion at the stream scale, and we demonstrate that accurate assessment of stream-scale 22 reactivity requires methods that integrate over all travel times. 23

#### <sup>24</sup> Plain Language Summary

Dissolved materials such as carbon, nutrients, and contaminants react as they move 25 through the river network. Some locations in the river are far more reactive than oth-26 ers, and it is challenging to predict how this spatial variability of reaction rates controls 27 the reactivity of the entire stream. One hotspot of high reactivity is the benthic biolayer, 28 a thin region below the sediment-water interface with an abundance of microbial activ-29 ity, and below which reactivity decreases to very low values. We use a mathematical model 30 31 to quantify the benthic biolayer's contribution to whole river material transformation, based on the biolayer's thickness and reactivity. We show that thin or less reactive bi-32 olayers allow dissolved mass to become sequestered for long periods deep in the streambed, 33 leading to low but persistent concentrations long after the mass is introduced to the river. 34 These theoretical advances improve our understanding of how measurable features of the 35 river – namely, the depth-dependent reaction rates within the streambed – are directly 36 related to biogeochemical transformations and contaminant retention timescales in rivers. 37

#### <sup>38</sup> 1 Introduction

A defining feature of rivers is the transition in physical and chemical characteris-39 tics across the sediment-water interface (SWI). Downstream velocities, mixing rates, and 40 light availability decrease rapidly at the SWI to viscous flows and light limited condi-41 tions (Jones & Mulholland, 1999). This transition zone, called the benthic biolayer, con-42 tributes disproportionately to the biologically-mediated transformation of reactive so-43 lutes and fine particulate matter in the river corridor, including heterotrophic carbon res-44 piration, nutrient cycling, and trace contaminant degradation (Battin et al., 2008; Kunkel 45 & Radke, 2008; Marzadri et al., 2017). Fluvial ecosystems are highly sensitive to phys-46 ical perturbations and elevated contaminant concentrations in the biolaver, since this re-47 gion supplies refugia and energy (as microbial biomass) for freshwater vertebrates (Jones 48 & Mulholland, 1999; Cardenas et al., 2016; Moran et al., 2017). Structural features of 49 the biolayer, such as its depth and reactivity, are therefore important predictors of whole-50 river reactivity and ecosystem health. 51

Dissolved oxygen depletes as aerated surface water propagates deeper into the hy-52 porheic zone (HZ), leading to conditions that sustain microbial communities with higher 53 tolerance for anoxia and slower metabolism. The stratification of chemical conditions and 54 microbial biomass below the sediment-water interface (SWI) creates sharp gradients in 55 reaction rates, as well as regions of low reactivity below the biolayer (Kunkel & Radke, 56 2008; Harvey et al., 2013; Knapp et al., 2017). The vertical profile of reaction rates is 57 challenging to determine not only because steep concentration gradients are difficult to 58 measure in pore waters, but also because various transport processes are simultaneously 59 active (e.g., advective pumping, molecular and turbulent diffusion, mechanical disper-60 sion). These processes are often grouped using scaling laws to estimate vertical solute 61

<sup>62</sup> fluxes across the SWI. Scaling predictions are related to subsurface concentrations by

assuming that solutes diffuse vertically (O'Connor & Harvey, 2008; Grant et al., 2012),

- <sup>64</sup> which allows the reaction profile to be inferred from a diffusion-reaction or similar 1-D
- transport model (Harvey et al., 2013; Knapp et al., 2017; Schaper et al., 2019).

Recent modeling efforts strongly suggest that spatial variability of reaction rates 66 in the biolayer controls the fate of reactive solutes at the stream scale. Numerical sim-67 ulations show that whole-stream transformation is  $5-25 \times$  greater when HZ reaction rates 68 are highest near the SWI, compared to a stream with the same average reactivity uni-69 70 formly distributed in the HZ (Li et al., 2017). These differences arise because solutes entering the HZ typically propagate through shallow, high reactivity flowpaths before re-71 turning to the water column. Process-based models must therefore account for the cor-72 relation between residence time in the stream and residence time in reactive regions of 73 the river bed. Traveltime based approaches for advection-dominated hyporheic flows ac-74 count for the variability of reaction rates between flow paths by assuming that fluid parcels 75 move unmixed through the HZ (Azizian et al., 2015; Reeder et al., 2018). However, we 76 currently lack a physics-based upscaling framework that accounts for the joint impact 77 of spatially varying reaction rates and diffusive mass transfer in the HZ. This knowledge 78 gap limits our understanding of how measurable features of the HZ contribute to river 79 corridor biogeochemistry, as well as how long streamborne contaminants are retained in 80 the benchic biolayer and the less reactive sublayer that can act as a secondary source. 81

This work is motivated by the questions of how the size and reactivity of the ben-82 thic biolayer influence reach-scale mass fate, and how these properties manifest in up-83 scaled observations of reactive transport. We isolate the effects of depth-dependent HZ 84 reaction rates on upscaled predictions of solute fate in a stream. Solute transport in the 85 HZ is considered to be dominated by vertical diffusion, which aligns our analysis with 86 existing diffusion-based scaling laws that predict hyporhetic exchange fluxes from mea-87 surable stream parameters. We present streambed-scale and reach-scale simulations de-88 signed to mimic a pulse tracer injection, which is a common method for assessing the 89 processes controlling reactive transport in rivers and whose results are extendable to other 90 boundary conditions (e.g., plateau injection experiments). We compare numerical results 91 to predictions from a classical mobile-immobile model with uniform reactions in the sub-92 surface, as well as predictions from a novel mobile-immobile model that explicitly rep-93 resents the vertically-varying reaction profile in the biolayer. 94

#### 95 2 Methods

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#### 2.1 Transport scenario

We consider the transport and reaction scenario illustrated in Figure 1 that com-97 prises the water column and HZ. The SWI is located at z = 0, the water column ex-98 tends from z = 0 to z = d, and the HZ extends from z = -h to z = 0. We set the 99 stream velocity to  $v(z) = v_s + v_0 \kappa^{-1} \ln(z/z_0)$  for  $z > z_0$  and zero for  $z < z_0$  (Fischer 100 et al., 1979). The length  $z_0$  is the width of a roughness layer at the SWI and represents 101 the effect of the porous streambed on the stream velocity,  $\kappa \approx 0.41$  is the von Karman 102 coefficient,  $v_0$  the shear velocity, and  $v_s$  the slip velocity at the SWI. We set v(z) = 0103 in the HZ, which assumes that streamwise velocity in the HZ is negligible compared to 104 the stream. Vertical mixing is quantified by the dispersion coefficient D(z), which is set 105 equal to  $D(z) = \kappa v_0 z (1 - z/d)$  for  $z > z_0$  in the water column (Fischer et al., 1979) 106 and equal to the constant effective diffusivity  $D_h$  in the HZ (Grant et al., 2012). We dis-107 regard streamwise dispersion and diffusion because advection in the water column dom-108 inates streamwise transport. 109

Solutes undergo first-order reactions in the HZ, which is a reasonable assumption when the modeled solute is limiting, that is, reactions are independent of the concen-

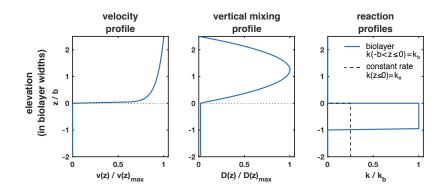


Figure 1. (Left to right) Spatial velocity, vertical mixing, and reaction profiles across the surface-subsurface continuum. The SWI is located at z = 0. The figures are truncated at z/b = -2 since all values are constant at deeper locations in the HZ.

tration of co-reactants, abundance of catalysts such as enzymes, or thermodynamic con-112 straints (Dodds et al., 2002; Garayburu-Caruso et al., 2020). The depth-dependent re-113 action rate k(z) can be an arbitrary function of streambed elevation, but typically de-114 creases sharply with depth due to the presence of a reactive biolayer. We follow Li et 115 al. (2017) and consider a biolayer structure consistent with field observations (Knapp 116 et al., 2017; Schaper et al., 2019; Inwood et al., 2007; O'Connor & Harvey, 2008). The 117 reaction rate is set to  $k(z) = k_b$  within a layer of thickness b just below the SWI. It is 118 set to k(z) = 0 in the non-reactive sublayer of thickness  $\ell = h - b$ . Other profiles that 119 decay on a characteristic length scale b are expected to show a qualitatively similar be-120 havior. The characteristic time scales in the HZ are given by the characteristic reaction 121 time  $\tau_r = k_b^{-1}$ , as well as the characteristic diffusion times  $\tau_h = h^2/D_h$  across the HZ, 122  $\tau_b = b^2/D_h$  across the biolayer, and  $\tau_\ell = \ell^2/D_h$  across the non-reactive sublayer. The 123 Damköhler number  $Da = \tau_b k_b$  compares the diffusion and reaction times in the bio-124 layer. We consider the order of time scales  $\tau_r \leq \tau_b < \tau_\ell$ , which means that  $Da \geq 1$ . 125 This implies that reactions can occur before solute is transmitted to the sublayer. If, on 126 the contrary  $\tau_r > \tau_b$  (i.e., Da < 1), only a small amount of solute can react before it 127 reaches the sublayer. In this case, the behaviors of reactive and conservative solutes are 128 very similar, and thus are not presented. The evolution of solute concentration C(x, z, t)129 in the combined stream-HZ system is expressed by the advection-dispersion equation 130

$$\theta(z)\frac{\partial C}{\partial t} + v(z)\frac{\partial C}{\partial x} - \frac{\partial}{\partial z}\left[\theta(z)D(z)\frac{\partial C}{\partial z}\right] = -\theta(z)k(z)C,$$
(1)

where the porosity  $\theta(z)$  equals 1 in the water column and a constant value  $\theta_h$  in the HZ. 133 The horizontal boundaries z = -h and z = d are impermeable. In line with the ex-134 perimental design of field tracer studies, we assume that the HZ is initially free of reac-135 tive mass, and solute is introduced as a line injection in the water column. The direct 136 advection-dispersion problem (1) is solved numerically using a reactive time-domain ran-137 dom walk approach (TDRW), based on the implementation of Russian et al. (2016) for 138 conservative solutes. The TDRW method is computationally efficient for media with spa-139 tially heterogeneous advection, diffusion and reaction properties. Details on the imple-140 mentation, discretization, and parameterization of the TDRW simulations are given in 141 supporting information Section SI-VI. In the following, we present the mobile-immobile 142 model that upscales this reactive transport scenario. In order to analyze the impact of 143 the benthic biolayer on whole stream reactive transport, we consider solute breakthrough 144 curves at a downstream control plane for different biolayer scenarios. 145

#### 2.2 Mobile-immobile biolayer (MIM-B) model

<sup>147</sup> We employ a mobile-immobile approach (Villermaux, 1974; Haggerty & Gorelick, <sup>148</sup> 1995) to upscale the reactive transport problem. Eq. (1) is decomposed into an advection-<sup>149</sup> dispersion equation for transport in the stream, a diffusion-reaction equation for the bi-<sup>150</sup> olayer, and an equation for vertical diffusion in the sublayer. These equations are cou-<sup>151</sup> pled through concentration and flux continuity at their respective interfaces. By verti-<sup>152</sup> cal averaging we obtain a temporally non-local evolution equation for the average stream <sup>153</sup> concentration  $\overline{C}_s(x, t)$ :

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$$\frac{\partial}{\partial t}\overline{C}_{s} + \frac{\theta_{h}}{d}\frac{\partial}{\partial t}\int_{0}^{s} dt'\varphi_{h}(t-t')\overline{C}_{s}(x,t') + \overline{v}\frac{\partial\overline{C}_{s}}{\partial x} - D^{*}\frac{\partial^{2}\overline{C}_{s}}{\partial x^{2}} = -\frac{\theta_{h}k_{b}}{d}\int_{0}^{t} dt'\varphi_{b}(t-t')\overline{C}_{s}(x,t').$$
(2)

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Details are provided in Section SI-II of the supporting information. The mean velocity 157 in the stream is denoted by  $\overline{v}$ , and the shear dispersion coefficient  $D^* = 5.93 v_0 d$  (Fischer 158 et al., 1979) quantifies the impact of vertical velocity variability on longitudinal disper-159 sion in the stream. The non-local term (second term on left side) denotes the time deriva-160 tive of the concentration in the HZ. It quantifies solute trapping, release, and degrada-161 tion in the hyporheic zone. The term on the right side demonstrates that the upscaled 162 reaction kinetics are temporally non-local, but nonetheless linear. The non-locality stems 163 from the fact that solute first diffuses into the biolayer before it reacts. Thus, the mass 164 degraded at a given time t is proportional to the stream concentrations  $C_s(x,t')$  at ear-165 lier times t'. The memory kernel  $\varphi_h(t)$  describes the evolution of mass in the HZ in re-166 sponse to an instantaneous solute pulse at the SWI. It is decomposed into  $\varphi_h(t) = \varphi_b(t) + \varphi_b(t)$ 167  $\varphi_0(t)$ , wherein  $\varphi_b(t)$  and  $\varphi_0(t)$  encode the diffusive and reactive mass transfer mecha-168 nisms across the biolayer and the non-reactive sublayer, respectively. Explicit Laplace 169 space expressions for  $\varphi_b(t)$  and  $\varphi_0(t)$  are given in Section SI-II C. While this formula-170 tion can be generalized to account for water column reactions (sensu Roche et al., 2019), 171 we exclusively model reactions in the HZ to elucidate the biolayer's influence on stream-172 scale reactivity. 173

#### 174 **2.3 Surrogate models**

To illustrate the benthic biolayer's impact on whole stream reactive transport, we contrast the MIM-B with two surrogate models, termed *S1* and *S2*. Model *S1* assumes the hyporheic zone is uniformly reactive over all depths. Model *S2* assumes that water column and HZ are in equilibrium.

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#### 2.3.1 Fully reactive hyporhetic zone (S1)

In agreement with classical assumptions (e.g., Runkel, 2007; Haggerty et al., 2009; 180 Aubeneau et al., 2015), S1 assumes that the HZ is fully reactive and characterized by 181 an equivalent reaction rate  $k_e$ . The evolution equation for  $\overline{C}_s$  is obtained from (2) by 182 substituting  $k_b$  with  $k_e$  and setting  $\varphi_h(t) = \varphi_b(t) \equiv \varphi_e(t)$ . The latter can be written 183 in terms of the memory kernel  $\phi(t)$  for a non-reactive solute as  $\varphi_e(t) = \phi(t) \exp(-k_e t)$  (Dentz 184 et al., 2011). We define  $k_e$  such that the total reacted mass in the HZ, in response to an 185 instantaneous solute pulse at the SWI, is equal to the total reacted mass in the MIM-186 B. Using this definition, we derive the following transcendental equation for  $k_e$  (see, SI-187 IV) 188

$$\sqrt{\frac{k_e}{k_b}} \tanh\left(\sqrt{k_e\tau_h}\right) = \tanh\left(\sqrt{Da}\right). \tag{3}$$

The solution of (3) can be approximated by  $k_e = k_b \tanh\left(\sqrt{Da}\right)^2$  for  $k_e \tau_h > 10$ . This implies that the equivalent streambed reactivity increases monotonically with Da and asymptotes towards  $k_b$  as  $Da \to \infty$ .

#### 2.3.2 Equilibrium model for the water column (S2)

<sup>195</sup> Model S2 assumes that the water column and the HZ are in equilibrium. The evo-<sup>196</sup> lution equation for  $\overline{C}_s$  in this limit is obtained from Eq. (2) by localization of the mem-<sup>197</sup> ory kernels on the left and right sides. This gives (Section SI-V)

$$R_a \frac{\partial}{\partial t} \overline{C}_s + \overline{v} \frac{\partial \overline{C}_s}{\partial x} - D^* \frac{\partial^2 \overline{C}_s}{\partial x^2} = -k_a \overline{C}_s(x, t'), \tag{4}$$

where the apparent retardation coefficient  $R_a$  and the apparent reaction rate  $k_a$  are defined by

$$R_a = 1 + \frac{\theta_h}{d} \int_0^\infty dt' \varphi_h(t'), \qquad \qquad k_a = \frac{\theta_h k_b}{d} \int_0^\infty dt' \varphi_b(t'). \tag{5}$$

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#### 2.4 Reach-scale reactivity

The two surrogate models S1 and S2 are defined such that they have the same downstream mass recovery as the MIM-B model. The fraction of mass recovered  $M_R$  at a downstream location is obtained by integration of the solute breakthrough curves over time from zero to infinity. Thus, we obtain from S2 the explicit expression

$$M_R(x) = \exp\left[-\frac{x\overline{v}}{2D^*}\left(\sqrt{1+\frac{4k_aD^*}{\overline{v}^2}}-1\right)\right].$$
(6)

This predicted exponential decrease is commonly observed in field experiments. The reach scale reactivity  $K_r$  [L<sup>-1</sup>] has been defined in the literature as the slope of the logarithm of  $M_R(x)$ , that is,  $K_r \equiv -x^{-1} \ln M_R(x)$  (Tank et al., 2017). Reach scale reactivity  $K_r$ reads in terms of the apparent reaction rate  $k_a$  as

$$K_r = \frac{\overline{v}}{2D^*} \left( \sqrt{1 + \frac{4k_a D^*}{\overline{v}^2}} - 1 \right). \tag{7}$$

Eq. (7) simplifies to  $K_r = k_a \overline{v}^{-1}$  in the limit  $D^* \to 0$ , meaning that  $M_r$  decays as  $\exp(-\tau_a k_a)$  in this limit, where  $\tau_a = x \overline{v}^{-1}$  is the advective travel time. Note that  $K_r$  is not a re-217 218 action rate. It facilitates the estimation of reach-scale mass removal integrated over all 219 times. This is important to note because the time scales for reaction can be very large 220 due to mass transfer limitation in the HZ, which has a dramatic impact on contaminant 221 removal and secondary release as discussed below. The evaluation of  $K_r$  is one of sev-222 eral methods that are often inter-compared to determine reach-scale reaction kinetics (e.g., 223 Finkler et al., 2021). For ease of interpretation, we present reach-scale reactivity as up-224 take velocities, which are commonly used for comparison across rivers. The inverse of 225  $K_r$  denotes the nutrient spiraling length  $S_w = K_r^{-1}$  [L], which describes the character-226 istic distance a reactant travels downstream before reacting. The uptake velocity  $v_f =$ 227  $K_{\tau}\overline{v}d$  [L T<sup>-1</sup>] measures demand for reactants relative to in-stream concentration (Tank 228 et al., 2017). 229

#### <sup>230</sup> 3 Results and discussion

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#### 3.1 Interplay between biolayer structure and solute fate in the HZ

Memory functions, which quantify the mass in the HZ resulting from an instantaneous solute pulse at the SWI, are shown in Figure 2 for (a) the sublayer, (b) the biolayer, and (c) the entire HZ, obtained from the direct numerical simulations and the
 analytical MIM-B.

The sublayer memory function  $\varphi_0$  increases from 0 to a maximum on the time scale  $\tau_b$ , which is the time for solute tansmission across the biolayer. It then decreases as  $t^{-1/2}$ , as for a conservative solute, due to diffusion back to the biolayer. Last, it tempers exponentially on the time scale  $\tau_\ell$  as the sublayer depletes by diffusion.

The memory function  $\varphi_b$  for the biolayer decays as  $t^{-1/2}$  for times smaller than the reaction time,  $t < \tau_R$ , due to diffusion across the SWI. For  $\tau_R < t < \tau_b$  mass is depleted from the biolayer by chemical reaction, which manifests in an exponential decrease of  $\varphi_b$  (Figure 2b). For times  $t \gg \tau_b$ , the biolayer can be considered well-mixed, and  $\varphi_b$ transitions to a  $t^{-3/2}$  decay because mass in the biolayer changes in a quasi-static fashion due to the mass flux from the sublayer (see SI-II D),

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$$\varphi_b(t) = -\frac{\tau_b}{1+Da} \frac{\mathrm{d}\varphi_0}{\mathrm{d}t} \propto t^{-3/2}.$$
(8)

The memory function  $\varphi_h$  integrates the diffusion-reaction process in the biolayer 248 and retention in the sublayer (Figure 2c). For times  $t \ll \tau_R$ , mass removal in the streambed 249 is primarily caused by diffusion upward across the SWI, and we observe the character-250 istic  $t^{-1/2}$  decay of a conservative solute. As discussed above, solute is depleted by re-251 action in the biolayer for  $\tau_R < t < \tau_b$ , giving rise to an exponential decay of  $\varphi_h$ . For 252  $t < \tau_b$  all remaining mass resides at shallow depth in the benchic biolayer, and the sys-253 tem behaves as a scenario of constant streambed reactivity. For  $t > \tau_b$ , however, so-254 lute diffuses into the inert sublayer. Eventually, most mass remaining in the streambed 255 is sequestered below the biolayer. The upward diffusion of mass from the inert sublayer 256 into the biolayer results in a second regime of  $\varphi_h(t) \sim t^{-1/2}$  (Figure 2c) because dif-257 fusion from the sublayer through the biolayer and to the stream is the dominant deple-258 tion process. Exponential tempering of  $\varphi_h(t)$  then occurs on the time scale  $\tau_\ell$  (Figure 259 2c). For comparison, we show memory functions for the corresponding surrogate model 260 S1 parameterized with  $k_e$  (Figure 2c dotted line). It decays as  $t^{-1/2}$  for times smaller 261 than the reaction time  $\tau_e = k_e^{-1}$  and exponentially fast for  $t > \tau_e$  as solute degrades 262 throughout the HZ. Thus, S1 predicts much faster depletion of reactant than the MIM-263 B because it does not account for long survival in the sublayer. 264

In summary, the interaction of reaction and diffusion processes in the HZ is gov-265 erned by three distinct timescales: the characteristic reaction time  $\tau_R = k_b^{-1}$ , which sets 266 the time for solute depletion from the biolayer by reaction; the diffusion time  $\tau_b$ , which 267 sets the time for solute transmission through the biolayer to the inert sublayer; and  $\tau_{\ell}$ , 268 which sets the time for diffusive depletion of solute from the sublayer. The match be-269 tween simulated and modeled memory functions shows that the MIM-B correctly cap-270 tures the long survival times in the HZ and the spatial segregation of reactants between 271 the biolayer and the non-reactive sublayer. 272

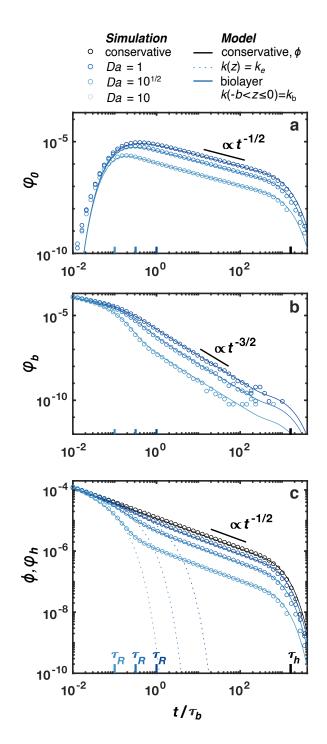


Figure 2. Modeled and simulated memory functions of varying biolayer Da. a) Memory functions for the inert sublayer show all mass in  $-h \leq z < b$ . b) Memory functions for the benthic biolayer show all mass in  $-b \leq z < 0$ . c) Full memory functions for conservative (black) and reactive (colored) solutes. Model and simulations transition to  $t^{-1/2}$  tailing for  $t \gg \tau_b (1 + Da)^{-1}$ . For all experiments, b = 0.05 m,  $D_h = 1.042 \times 10^{-6} \text{ m}^2 \text{s}^{-1}$ , h = -2 m, and  $k_b$  is varied.

#### 3.2 Reach-scale observations and model predictions

#### 274 3.2.1 Breakthrough curves

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Figure 3 shows BTCs for conservative and reactive solutes from numerical simu-275 lations and MIM-B model predictions, as well as MIM-B prediction for the biolayer con-276 centration at a control plane 100 m downstream from the injection point. These results 277 are compared to the prediction of surrogate model S1 for a fully reactive HZ. The con-278 servative BTC decays as a power law with  $t^{-3/2}$  and is cut off at the characteristic dif-279 fusion time across the HZ. This behavior is characteristic of diffusive mass transfer and 280 secondary release from the HZ. The BTC for the reactive solute shows the same tailing 281 features as the conservative BTC, albeit at lower concentrations due to degradation in 282 the biolayer. The strong tailing of the contaminant concentration is caused by transmis-283 sion of unreacted solute to the sublayer and release back into the stream through the bi-284 olayer. These behaviors are correctly quantified by the MIM-B, which predicts similar 285 behavior for the contaminant concentration in the biolayer. This shows that both the 286 stream and the biolayer are sourced by upward diffusion of solute sequestered in the sub-287 layer. Results mirror results from memory function simulations, demonstrating that bi-288 olayer structure has a similar influence on degradation timescales at both the local scale 289 and the whole-stream scale. On the other hand, S1 predicts exponential decay of the BTC 290 on the reaction timescale and thus severely under-predicts late time contaminant lev-291 els.

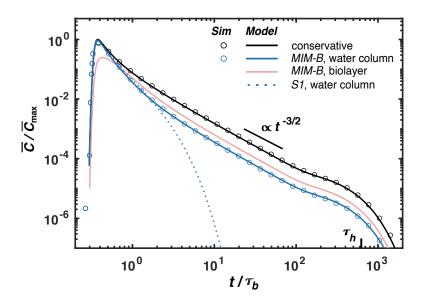


Figure 3. Simulated and MIM-B predicted BTCs for a pulse tracer injection with x = 100 m and b = 0.08 m, corresponding to Da = 1.2. See Section SI-VI for other parameter values.  $C_{\text{max}}$  equals maximum concentration of the analytical solution for the conservative BTC.

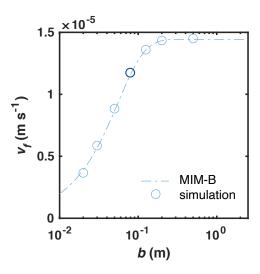
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The exact match between simulated BTCs and MIM-B predictions demonstrates that the MIM-B fully captures the impact of long survival times in the HZ, as well as the spatial segregation of reactants in the HZ, on reach scale transport and degradation. Notably, the model predicts a power law decay of survival times for all *Da*. This indicates the potential of MIM-B to provide correct estimates of trace contaminants in benthic sediments and the stream over a range of different physical and chemical conditions in the HZ. Trace organic contaminants (TOCs) are now detected in most rivers (Bernhardt

et al., 2017) and impair stream ecosystems at low levels, for example, endocrine disrupt-300 ing compounds that alter fish physiology at nanomolar concentrations (Adeel et al., 2017; 301 Khanal et al., 2006). Degradation rates of TOCs decrease rapidly with depth in the HZ 302 and span a range of half lives (Kunkel & Radke, 2008; Schaper et al., 2019). These char-303 acteristics allow TOCs to persist in sediments long after they enter the river network and 304 act as a secondary source (Ciparis et al., 2012; Cozzarelli et al., 2017). This suggests that 305 their degradation timescales must be estimated by explicitly accounting for the verti-306 cally varying reaction rates in the HZ (see SI-VII). 307

#### 3.2.2 Reach-scale reactivity

Calculated  $v_f$  resulting from integration of the simulated BTC, sensu Tank et al. 309 (2008), agrees well with the analytical prediction from the MIM-B model (Eq. 7, Fig-310 ure 4). The plot also shows that  $v_f$  approaches an asymptotic value for values b larger 311 than the characteristic survival depth  $s = (D_h/k_b)^{1/2}$ , which denotes the diffusion length 312 during the reaction times  $\tau_R$ . This implies that the spatial extension of the biolayer 313 has little bearing on whole-stream reactivity for b > s. When  $b \gg s$ , nearly all solute 314 reacts before propagating below the biolayer. In contrast, a substantial amount of mass 315 propagates through the biolayer unreacted when b < s, resulting in a lower effective 316 reactivity of the HZ (see SI-VII) and a lower reach-scale reactivity.



**Figure 4.** Reach-scale reactivity reported as uptake velocity, for streambeds containing biolayers with varying *b*. The reaction rate is  $k_b = 2.0 \times 10^{-4} \text{ s}^{-1}$  and corresponds to a characteristic survival depth of s = 0.07 m. See Section SI-VI for all parameter values. Dark blue circle is result from the simulation shown in Figure 3.

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The MIM-B gives exact estimates of reach-scale reactivity under the assumed con-318 ditions of diffusion dominated transport and stratified reactivity in the HZ. It should be 319 emphasized that these estimates are only valid when made at asymptotic times. Tran-320 sient storage in the HZ delays transport through the reach, causing mass to arrive sig-321 nificantly later than the advective timescale  $\tau_a = x \overline{v}^{-1}$ , upon which metrics such as 322  $v_f$  are typically based. This delay can cause time-resolved methods for estimating reach-323 scale reactivity to deviate systematically from the reactivity calculated from integrated 324 mass transformation. For example, results from pulse tracer injection experiments are 325 commonly used to calculate a different effective reaction rate for each data point of the 326 BTC, wherein the reaction time is set to the breakthrough time (Covino et al., 2010). 327

The effective rates calculated from this method depend nonlinearly on reactant concen-328 tration even when reactions within the reach are linear, which may lead to the conclu-329 sion that reaction kinetics are nonlinear (Li et al., 2021). Integrated methods, such as 330 integration of the BTC or constant rate injection experiments, account for the transport 331 and reaction delays associated with non-local transport to the HZ and mass sequestra-332 tion below the biolayer. Nevertheless, using these methods may require very long obser-333 vation times in order to account for the power law decay of reactive mass released from 334 the sublayer, and they provide no information about when concentrations may exceed 335 critical thresholds. Finally, it is important to note that neither method gives informa-336 tion on the actual reaction kinetics and time evolution of the downstream contaminant 337 concentration. The derived upscaled MIM-B shows that reaction kinetics are in fact non-338 local as expressed by the right side of Eq. (2) and characterized by a power-law decay 339 of contaminant survival times. 340

#### <sup>341</sup> 4 Conclusion

Two fundamental challenges for providing mechanistic predictions of river corri-342 dor reactivity are to explicitly link local heterogeneity of the controlling physical pro-343 cesses to upscaled observations within a consistent modeling framework, and to identify 344 the relative importance of microscale processes and structural features of the river cor-345 ridor (Ward & Packman, 2019; Kelleher et al., 2019). We address these challenges by 346 analyzing and upscaling reactive transport in a river-streambed system characterized by 347 a benthic biolayer. Isolating the dominant small scale features, we derive a novel upscaled 348 model (MIM-B) that captures the dominant physical and chemical processes in the ben-349 thic biolayer, the HZ, and reach scale. The model predictions closely agree with detailed 350 numerical simulations of transport and reaction in the river-streambed system. 351

We find that the biolayer structure strongly controls solute degradation in the HZ 352 and at the reach scale. Accumulation in the sublayer leads to long survival times for re-353 active solute, characterized by a power-law decay of concentration and by the spatial seg-354 regation of mass in the HZ. This is in stark contrast to model predictions based on the 355 classical assumption of a fully reactive HZ, for which the contaminant concentration de-356 cays exponentially fast on the characteristic reaction time scale and thus strongly under-357 predicts contaminant levels in the tail. The novel MIM-B captures all aspects of con-358 taminant degradation on the HZ and reach scales. Specifically, it correctly predicts tail 359 concentrations and reach scale reactivity. Reach scale reactivity quantifies the reaction 360 potential of the system; however, this potential can in principle only be observed at very 361 long experimental times due to the role of the sublayer as a secondary release. 362

Although we assume solutes diffuse vertically through the HZ in order to align our model with empirical scaling laws, we expect similar qualitative behavior in any streambed with vertically varying reaction rates and a multiscale residence time distribution (e.g., Elliott & Brooks, 1997). The characteristics of reactant fate identified within our model framework are critical for assessing contamination levels in streams and in shallow sediments, which are dramatically underestimated at late times by classical models that assume uniform reaction rates in the hyporheic zone.

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## Supporting Information: Benthic biolayer structure controls whole-stream reactive transport

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#### SI-I. FLOW AND MIXING PROFILES

We employ the following velocity profile

$$v(z) = \overline{v} + v_0 / \kappa [1 + \ln(z/d)]$$
(S1)

where  $\overline{v}$  is the average velocity over the full vertical cross section between the sediment-water interface (SWI) at z = 0and the air-water interface at z = d. We introduce the length  $z_0$ , which represents a porous layer on the SWI, and we set v(z) = 0 for  $z < z_0$ . This implies that  $v(z_0) > 0$  represents the slip velocity at the SWI. In this sense, we rewrite expression (S1) as follows

$$v(z) = v(z_0) + \overline{v} + v_0 \kappa^{-1} \left[ 1 + \ln[(z/d)] - (\overline{v} + v_0/\kappa [1 + \ln(z_0/d)]) \right]$$
(S2)

Setting  $v(z_0) \equiv v_s$ , we write

$$v(z) = v_s + v_0 \kappa^{-1} \ln[(z/z_0)].$$
(S3)

Vertical mixing is represented by the dispersion coefficient [1]

$$D(z) = v_0^2 (1 - z/d) \frac{1}{\mathrm{d}v(z)/\mathrm{d}z} = v_0 z \kappa (1 - z/d)$$
(S4)

for  $z > z_0$ . At  $z < z_0$ , we set  $D(z) = D_h$ .

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#### SI-II. MOBILE-IMMOBILE BIOLAYER (MIM-B) MODEL

#### A. Vertical Average

In order to upscale the reactive transport problem, we employ a dual porosity approach and separate the transport equation (1) in the main manuscript into an equation that describes advection-dispersion in the river,

$$\frac{\partial C_s}{\partial t} + v(z)\frac{\partial C_s}{\partial x} - \nabla \cdot [D(z)\nabla C_s] = 0,$$
(S5a)

and an equation for diffusion-reaction in the hyporheic zone

$$\theta_h \frac{\partial C_h}{\partial t} - D_h \theta_h \frac{\partial C_h}{\partial z^2} = -k(z)\theta_h C_h, \tag{S5b}$$

where the concentrations in the river and hyporheic zone (HZ) are denoted by  $C_s$  and  $C_h$ , respectively,  $\theta_h$  is the porosity in the hyporheic zone (assumed constant), and D(z) is the effective vertical diffusion coefficient. Note that diffusion in direction of the stream is disregarded here because it is considered very small compared to the effects of shear dispersion. Both domains are coupled through concentration and flux continuity at the interface located at z = 0,

$$C_h(x, z = 0, t) = C_s(x, 0, t)$$
 (S6)

$$D(z) \left. \frac{\partial C_s}{\partial z} \right|_{z=0} = D_h \theta_h \partial_z C_h|_{z=0} \tag{S7}$$

We define now the vertical average over the stream as

$$\overline{C}_s = \frac{1}{d} \int_0^d \mathrm{d}z \, C_s. \tag{S8}$$

Vertical averaging of Eq. (S5) gives

$$\frac{\partial \overline{C}_s}{\partial t} + \overline{v} \frac{\partial \overline{C}_s}{\partial x} - D^* \frac{\partial^2 \overline{C}_s}{\partial x^2} = -\theta_h D_h \frac{\partial C_h}{\partial z} \Big|_{z=0},$$
(S9)

where we use flux-continuity at the interface expressed by Eq. (S7), and  $D^*$  is the shear dispersion coefficient defined in the main text. The diffusive flux on the right side can be expressed in terms of the accumulation and reaction terms in the hyporhecization by integrating Eq. (S5a) over z. This gives

$$\theta_h D_h \left. \frac{\partial C_h}{\partial z} \right|_{z=0} = \theta_h \frac{\partial}{\partial t} M_h + \int_{-h}^{0} \mathrm{d}z \, k(z) \theta_h C_h, \tag{S10}$$

where we defined the vertically integrated concentration  $M_h$  in the hyporheic zone as

$$M_h = \int_{-h}^{0} \mathrm{d}z \, C_h. \tag{S11}$$

Thus, we can write the following evolution equation for the average concentration  $\overline{C}_s$  in the stream,

$$\frac{\partial}{\partial t} \left( \overline{C}_s + \frac{\theta_h}{d} M_h \right) + \overline{v} \frac{\partial \overline{C}_s}{\partial x} - D^* \frac{\partial^2 \overline{C}_s}{\partial x^2} = -\frac{1}{d} \int_{-h}^{0} \mathrm{d}z \, k(z) \theta_h C_h, \tag{S12}$$

The term on the right side of (S12) represents a sink term for the stream domain due to reactions in the hyporheic zone. The derivation of the vertical average in the stream gives rise to the shear dispersion coefficient, which quantifies the impact of velocity variability with depth on longitudinal dispersion [1].

#### B. Closure

In order to close Eq. (S12), we need to express  $M_h$  and the right side in terms of  $\overline{C}_s$ . As a first step, we approximate the interface condition (S6) by

$$C_h(x, z = 0, t) = \overline{C}_s(x, t), \tag{S13}$$

which assumes that concentration in the stream is uniform in the vertical. Furthermore, invoking the Duhamel's theorem [2], we note that the solution of Eq. (S5b) can be written as

$$C_h = \int_0^t \mathrm{d}t' \, g(z, t - t') \overline{C}_s(x, t'), \tag{S14}$$

where the Green function g(z, t) satisfies

$$\frac{\partial g}{\partial t} - D_h \frac{\partial^2 g}{\partial z^2} = -k(z)g. \tag{S15}$$

for the boundary condition  $g(z=0,t) = \delta(t)$ . Thus, we can write (S11) as

$$M_h = \int_0^t \mathrm{d}t' \,\varphi_h(t-t') \overline{C}_s(x,t'),\tag{S16}$$

where the memory function

$$\varphi_h(t) = \int_{-h}^{0} \mathrm{d}z \, g(z, t), \tag{S17}$$

denotes the mass in the hyporheic zone in response to an instantaneous solute pulse at the SWI. The reaction term on the right side of Eq. (S12) is given by

$$\theta_h \int_{-h}^{0} \mathrm{d}z \, k(z) C_h = \theta_h \int_{0}^{t} \mathrm{d}t' \, \varphi_r(t') \overline{C}_s(z, t - t'), \tag{S18}$$

where we defined the reactive memory function  $\varphi_r(t)$  by

$$\varphi_r(t) = \int_{-h}^{0} \mathrm{d}z \, k(z) g(z, t). \tag{S19}$$

Thus, Eq. (S12) can be written as

$$\frac{\partial}{\partial t}\overline{C}_s + \frac{\theta_h}{d}\frac{\partial}{\partial t}\int_0^t \mathrm{d}t'\,\varphi_h(t-t')\overline{C}_s(x,t') + \overline{v}\frac{\partial\overline{C}_s}{\partial x} - D^*\frac{\partial^2\overline{C}_s}{\partial x^2} = -\frac{\theta_h}{d}\int_0^t \mathrm{d}t'\,\varphi_r(t')\overline{C}_s(z,t-t').\tag{S20}$$

Note that closed form expressions for the Green function g(z,t) for arbitrary reaction profiles are generally not available. In the following, we solve this problem for the biolayer reaction scenario.

#### C. Biolayer

For the reaction profile  $k(z) = k_b \mathbb{I}(-b < z < 0)$ , the reactive memory function (S19) can be written as

$$\varphi_r(t) = k_b \varphi_b(t). \tag{S21}$$

where we defined

$$\varphi_b(t) = \int_{-b}^{0} \mathrm{d}z \, g(z, t). \tag{S22}$$

In order to determine explicit expressions for the memory function, we solve now Eq. (S15) for the Green function. For convenience, we define a local coordinate system such that the interface between the biolayer and the sublayer is located at z' = 0, the interface between stream and streambed is located at z' = b, and the lower boundary of the hyporheic zone is located at  $z' = b - h \equiv -\ell$ . In the following we omit the primes for compactness of notation. We separate Eq. (S15) for the hyporheic zone into two coupled equations, one for the biolayer and one for the sublayer. The equation for the Green function  $g_b(z, t)$  in the biolayer is

$$\frac{\partial g_b}{\partial t} - D_h \frac{\partial^2 g_b}{\partial z^2} = -k_b g_b \tag{S23a}$$

for the initial condition  $g_b(z,t=0) = 0$  and the boundary condition  $g_b(z=b,t) = \delta(t)$ . The equation for the concentration  $g_0(z,t)$  in the sublayer is

$$\frac{\partial g_0}{\partial t} - D_h \frac{\partial^2 g_0}{\partial z^2} = 0.$$
(S23b)

At the interface between biolayer and sublayer at z = 0, we have concentration and flux continuity, that is,  $g_b = g_0$ and  $\partial g_b/\partial z = \partial g_0/\partial z$ . The boundary condition for  $g_0$  at  $z = -\ell$  is  $\partial g_0/\partial z = 0$ .

In order to solve for the Green functions  $g_b$  and  $g_0$ , we consider the system (S23) in Laplace space. Laplace transformed quantities in the following are marked by an asterisk, and the Laplace variable is denoted by  $\lambda$  (i.e.,  $g^* = \int_0^\infty dt \, e^{-\lambda t} g$ , [3]). Thus, we obtain for (S23a)

$$\lambda g_b^* - D_h \frac{\partial^2 g_b^*}{\partial z^2} = -k_b g_b^* \tag{S24a}$$

and the boundary condition  $g_b^*(z=b,\lambda)=1$ . The Laplace transform of (S23b) is given by

$$\lambda g_0^* - D_h \frac{\partial^2 g_0^*}{\partial z^2} = 0.$$
 (S24b)

At the interface at z = 0, we have

$$g_b^* = g_0^*, \qquad \qquad \frac{\partial g_b^*}{\partial z} = \frac{\partial g_0^*}{\partial z}.$$
 (S25)

Thus, the Laplace transform of  $g_0(z,t)$  in the sublayer can be expressed in terms of the concentration  $g_b^*(z=0,\lambda)$  as

$$g_0^*(z,\lambda) = G^*(z,\lambda)g_b^*(z=0,\lambda),$$
 (S26)

where the Green function  $G^*(z,\lambda)$  satisfies (S24b) for the boundary condition G=1 at z=0. It is given by

$$G^*(z,\lambda) = \frac{\cosh(\sqrt{\lambda\tau_0}(1+z/\ell))}{\cosh(\sqrt{\lambda\tau_0})},\tag{S27}$$

where we defined  $\tau_0 = \ell^2 / D_h$ .

The fundamental solution for  $g_b^*(z,\lambda)$  is

$$g_b^*(z,\lambda) = A\exp(-zB) + C\exp(zB), \qquad B = \sqrt{(\lambda+k_b)/D_h}, \qquad (S28)$$

where the constants A and C are determined from the Dirichlet boundary condition at z = 0 and the Neumann boundary condition at z = b. Note that concentration continuity at z = 0 is automatically fulfilled by (S26). Thus, we obtain the solution

$$g_b^*(z,\lambda) = \frac{\cosh(\sqrt{(\lambda+k_b)\tau_b}\,z/b) + \sqrt{\frac{\lambda}{\lambda+k_b}}\,\tanh(\sqrt{\lambda\tau_0})\sinh(\sqrt{(\lambda+k_b)\tau_b}\,z/b)}{\cosh(\sqrt{(\lambda+k_b)\tau_b}) + \sqrt{\frac{\lambda}{\lambda+k_b}}\,\tanh(\sqrt{\lambda\tau_0})\sinh(\sqrt{(\lambda+k_b)\tau_b})}.$$
(S29)

$$\varphi_b^*(\lambda) = \int_0^b \mathrm{d}z \, g_b^*(z,\lambda) = \sqrt{\frac{D_h}{\lambda + k_b}} \frac{\sinh(\sqrt{(\lambda + k_b)\tau_b}) + \sqrt{\frac{\lambda}{\lambda + k_b}} \tanh(\sqrt{\lambda\tau_0}) \left[\cosh(\sqrt{(\lambda + k_b)\tau_b}) - 1\right]}{\cosh(\sqrt{(\lambda + k_b)\tau_b}) + \sqrt{\frac{\lambda}{\lambda + k_b}} \tanh(\sqrt{\lambda\tau_0}) \sinh(\sqrt{(\lambda + k_b)\tau_b})}$$
(S30)

Furthermore, we obtain for the concentration  $g_0^*(z,\lambda)$  in the sublayer,

$$g_0^*(z,\lambda) = \frac{G^*(z,\lambda)}{\cosh(\sqrt{(\lambda+k_b)\tau_b}) + \sqrt{\frac{\lambda}{\lambda+k_b}} \tanh(\sqrt{\lambda\tau_0})\sinh(\sqrt{(\lambda+k_b)\tau_b})}$$
(S31)

The mass  $\varphi_0$  in the sublayer in terms of its Laplace transform is

$$\varphi_0^*(\lambda) = \int_{-\ell}^0 \mathrm{d}z \, g_0^*(z,\lambda) = \sqrt{\frac{D_h}{\lambda}} \frac{\tanh(\sqrt{\lambda\tau_0})}{\cosh(\sqrt{(\lambda+k_b)\tau_b}) + \sqrt{\frac{\lambda}{\lambda+k_b}} \tanh(\sqrt{\lambda\tau_0}) \sinh(\sqrt{(\lambda+k_b)\tau_b})} \tag{S32}$$

The Laplace transform  $\varphi_h^*(\lambda)$  of the memory function  $\varphi_h$ , which denotes the mass in the hyporheic zone in response to Delta pulse at the stream-streambed interface, is thus given by

$$\varphi_h^*(\lambda) = \varphi_b^*(\lambda) + \varphi_0^*(\lambda). \tag{S33}$$

In conclusion, we can write the governing equation (S20) for  $\overline{C}_s$  as

$$\frac{\partial}{\partial t}\overline{C}_s + \frac{\theta_h}{d}\frac{\partial}{\partial t}\int_0^t \mathrm{d}t'\,\varphi_h(t-t')\overline{C}_s(x,t') + \overline{v}\frac{\partial\overline{C}_s}{\partial x} - D^*\frac{\partial^2\overline{C}_s}{\partial x^2} = -\frac{\theta_h k_b}{d}\int_0^t \mathrm{d}t'\,\varphi_b(t-t')\overline{C}_s(x,t'). \tag{S34}$$

Note that the vertically integrated concentration  $M_b$  in the biolayer is given in terms of the biolayer memory function  $\varphi_b(t)$  as

$$M_b = \int_0^t \mathrm{d}t' \,\varphi_b(t-t') \overline{C}_s(x,t'). \tag{S35}$$

#### D. Mass balance

The mass conservation equation for the benchic biolayer is obtained by integrating Eq. (S23a) from 0 to b. This gives

$$\frac{\mathrm{d}\varphi_b}{\mathrm{d}t} = -D_h \frac{\partial g_b(z=0)}{\partial z} + D_h \frac{\partial g_b(z=b)}{\partial z} - k_b \varphi_b.$$
(S36)

The first and second terms on the right hand side denote mass transfer across the interfaces with the sublayer and the stream, the third term is a sink term due to reaction. Using flux continuity over the interface at z = 0, we can express the right side in terms of the mass  $\varphi_0$  in the sublayer as

$$\frac{\mathrm{d}\varphi_b}{\mathrm{d}t} = -\frac{\mathrm{d}\varphi_0}{\mathrm{d}t} + D_h \frac{\partial g_b(z=b)}{\partial z} - k_b \varphi_b,\tag{S37}$$

The reacted mass  $m_R$  is obtained from

$$\frac{\mathrm{d}m_R(t)}{\mathrm{d}t} = k_b \varphi_b(t) \tag{S38}$$

and therefore

$$m_R^{\infty} = k_b \varphi_b^* (\lambda = 0). \tag{S39}$$

From the explicit expression (S30), we obtain

$$m_R^{\infty} = \sqrt{\frac{D_h}{k_b}} \tanh(\sqrt{k_b \tau_b}).$$
(S40)

where  $\tau_b = b^2/D_h$ . For times  $t \gg \tau_b$ , that is, for times much larger than the time for complete mixing of the biolayer, we set  $g_b$  equal to the mean concentration in the biolayer,

$$g_b = \frac{\varphi_b}{b}.\tag{S41}$$

Furthermore, we approximate the derivative of  $g_b$  at z = b as

$$\frac{\partial g_b}{\partial z} = -\frac{g_b}{b} = -\frac{\varphi_b}{b^2}.$$
(S42)

With this approximation, the mass balance equation (S37) can be written as

$$\frac{\mathrm{d}\varphi_b}{\mathrm{d}t} = -\frac{\mathrm{d}\varphi_0}{\mathrm{d}t} - \frac{D_h}{b^2}\varphi_b - k_b\varphi_b,\tag{S43}$$

We can furthermore write

$$\frac{\mathrm{d}\varphi_b}{\mathrm{d}t} = -\frac{\mathrm{d}\varphi_0}{\mathrm{d}t} - \frac{1+Da}{\tau_b}\varphi_b.$$
(S44)

The solution of this equation can be obtained by separation of variables as

$$\varphi_b(t) = \frac{b}{\tau_b} \exp(-\alpha t) - \int_t^\infty dt' \, \exp[-\alpha(t-t')] \frac{\mathrm{d}\varphi_0(t')}{\mathrm{d}t'},\tag{S45}$$

where we defined  $\alpha = (1 + Da)/\tau_b$ , and used the initial condition  $\varphi_b(t = 0) = b/\tau_b$ . This initial condition is obtained from the solution of the equivalent conservative problem, that is, for  $k_b = 0$  in (S43) and using mass conservation (the integral over all times equal to one), because at t = 0, the two solutions should coincide. Note that the approximation made here for calculation  $\varphi_b(t)$  are valid at times  $t > \tau_b$ . We know that the early time behavior is otherwise different from the exact solution (S30).

For  $\alpha t \gg 1$ , the first terms on the right side of (S45) can be disregarded, and the integral can be localized at t' = t. That is, as the exponential is sharply peaked about t = t', we can set

$$\varphi_b(t) = -\frac{\mathrm{d}\varphi_0(t)}{\mathrm{d}t} \int_t^\infty \mathrm{d}t' \, \exp[-\alpha(t-t')]. \tag{S46}$$

Thus, we obtain

$$\varphi_b(t) = -\frac{\tau_b}{1+Da} \frac{\mathrm{d}\varphi_0(t)}{\mathrm{d}t}.$$
(S47)

This implies, the mass in the biolayer scales as the time derivative of the mass in the sublayer.

#### SI-III. ANALYTICAL LAPLACE SPACE SOLUTIONS

In the following we provide explicit analytical solutions for the breakthrough curves in the MIM-B and the S1 models.

#### A. Stream concentration in the MIM-B model

We solve Equation (S34) for the boundary condition  $\overline{C}_s(x=0,t) = \delta(t)$ . To this end, we transform (S34) to Laplace space, which gives

$$\lambda \overline{C}_s^* + \theta_h d^{-1} [\lambda \varphi_h^*(\lambda) + k_b \varphi_b^*(\lambda)] \overline{C}_s^*(x,\lambda) + \overline{v} \partial_x \overline{C}_s^*(\lambda) - D^* \partial_x^2 \overline{C}_s^*(\lambda) = 0.$$
(S48)

The boundary condition reads as

$$\overline{C}_s(x=0,\lambda) = 1. \tag{S49}$$

The solution can be obtained by using the exponential fundamental solution. This gives the explicit expression

$$\overline{C}_{s}^{*}(x,\lambda) = \exp\left[-\frac{x\overline{v}}{2D^{*}}\left(\sqrt{1+4\frac{(\lambda+\theta_{h}d^{-1}[\lambda\varphi_{h}^{*}(\lambda)+k_{b}\varphi_{b}^{*}(\lambda)])D^{*}}{\overline{v}^{2}}}-1\right)\right].$$
(S50)

#### B. Stream concentration in surrogate model S1

We consider the scenario that the entire hyporheic zone is characterized by a constant reactivity, which is used in the main text to define a constant equivalent reactivity for the streambed.

We set  $k(z) = k_e$  = constant. In this case, the transport equation (2) simplifies to

$$\partial_t \left[ \overline{C}_e + \frac{\theta_h}{d} \int_0^t \mathrm{d}t' \,\varphi_e(t-t') \overline{C}_s(t') \right] + \overline{v} \partial_x \overline{C}_e - \overline{D}^* \partial_x^2 \overline{C}_e = -\frac{\theta_h k_e}{d} \int_0^t \mathrm{d}t' \,\varphi_e(t-t') \overline{C}_e(t'), \tag{S51}$$

where  $\overline{C}_e$  is the vertically averaged water column concentration, and the reactive memory function is given by

$$\varphi_e(t) = \phi(t) \exp(-k_e t), \tag{S52}$$

and in Laplace space

$$\varphi_e^*(\lambda) = \phi^*(\lambda + k_e). \tag{S53}$$

The conservative memory function  $\phi(t)$  is defined in Laplace space by

$$\phi^*(\lambda) = \sqrt{\frac{D_h}{\lambda}} \tanh(\sqrt{\lambda\tau_h}). \tag{S54}$$

The solution of (S51) for the boundary condition  $\overline{C}_0^*(x=0,t) = \delta(t)$  reads in Laplace space as

$$\overline{C}_{e}^{*}(x,\lambda) = \exp\left[-\frac{x\overline{v}}{2D^{*}}\left(\sqrt{1+4\frac{[\lambda+\theta_{h}d^{-1}(\lambda+k_{e})\phi^{*}(\lambda+k_{e})]D^{*}}{\overline{v}^{2}}}-1\right)\right].$$
(S55)

#### SI-IV. EFFECTIVE REACTION RATE IN THE STREAMBED

The effective reaction rate  $k_e$  in S1 is defined such that the reacted mass in response to a solute pulse is equal to the reacted mass in the MIM-B model. The reacted mass in the HZ in response to a point injection is obtained by integration of (S15) over the reactive region of the HZ. Thus, we obtain

$$M_R(t) = k_b \int_0^t \mathrm{d}t' \,\varphi_B(t') \tag{S56}$$

for the MIM-B model and

$$M_R(t) = k_e \int_0^t \mathrm{d}t' \,\varphi_e(t') \tag{S57}$$

We set the total reacted mass equal. This implies

$$k_e \int_{0}^{\infty} \mathrm{d}t' \,\varphi_e(t') = k_b \int_{0}^{\infty} \mathrm{d}t' \,\varphi_b(t') \tag{S58}$$

In Laplace space, the equation reads as

$$k_e \varphi_e^*(0) \equiv k_b \varphi_b^*(0). \tag{S59}$$

Using expressions (S30), (S32) and (S33), as well as (S53) and (S54) gives Equation (3) in the main text.

#### SI-V. APPARENT RETARDATION COEFFICIENT AND REACTION RATE

Explicit expressions for the apparent retardation coefficient and reaction rate are obtained by expressing the integral terms in Eq. (5) in terms of the Laplace transformed memory functions. This gives

$$R_a = 1 + \frac{\theta_h}{d} \varphi_h^*(0), \qquad \qquad k_a = \frac{\theta_h k_b}{d} \varphi_b^*(0) \qquad (S60)$$

Using that  $\varphi_h(t) = \varphi_b(t) + \varphi_0(t)$  and the explicit expressions (S30) for  $\varphi_b^*(\lambda)$  and (S32) for  $\varphi_0^*(\lambda)$ , we obtain

$$R_a = 1 + \frac{\theta_h}{d} \left[ \frac{\sqrt{D_h \tau_0}}{\cosh(\sqrt{k_b \tau_b})} + \sqrt{\frac{D_h}{k_b}} \tanh\left(\sqrt{k_b \tau_b}\right) \right]$$
(S61)

$$k_a = \frac{\theta_h}{d} \sqrt{D_h k_b} \tanh\left(\sqrt{k_b \tau_b}\right). \tag{S62}$$

#### SI-VI. DIRECT NUMERICAL SIMULATIONS

The direct numerical simulations are based on the time-domain random walk method (TDRW) outlined in Russian et al. [4] for conservative solutes. In this framework, reactions in the biolayer are modeled by assigning a survival probability to each particle in the biolayer. For each TDRW step of duration  $\tau$ , the survival probability is  $\exp(-k_b\tau)$ . A Bernoulli trial decides whether the particle survives or reacts at each step. To ensure that our results are consistent with continuum assumptions in our analytical model, we restrict our analysis to times greater than the characteristic residence time in a single grid cell. For all simulations,  $D_h = 1.042 \times 10^{-6} \text{ m}^2 \text{ s}^{-1}$  and h = -2 m, and  $\theta_h = 1$ . Porosity of the subsurface only rescales d and therefore is set to 1 without loss of generality (S48).

Memory function (i.e., streambed-scale) simulations are designed to mimic a pulse injection at the SWI. We release  $N_0$  particles in the first grid cell below the SWI, and we quantify the total number of particles remaining in the HZ. For all simulations b = -0.05 m, and the grid resolution is set to  $\Delta z = 5 \times 10^{-2}$  m. Parameter  $k_b$  is varied to achieve a range of Da.

Reach-scale simulations are designed to mimic a pulse tracer injection commonly performed in field experiments. We release  $N_0$  particles uniformly in the mobile zone at x = 0 m and t = 0 s. Breakthrough curves (BTCs) are given by the distribution of particle arrival times at a downstream distance x. We vary  $0.02 \le |b| \le 0.5$  m across simulations while holding other parameters constant. For all experiments, d = 0.05 m,  $v_0 = 0.005$  m s<sup>-1</sup>,  $\overline{v} = 0.05$  m s<sup>-1</sup>,  $D^* = 0.0015$  m<sup>2</sup>s<sup>-1</sup>, and  $k_b = 2.0 \times 10^{-4}$  s<sup>-1</sup>. The grid resolution is set to  $\Delta z = 2 \times 10^{-2}$  m.

#### SI-VII. FIELD COMPARISON

We compared simulated and modeled Da to values of Da estimated from Schaper *et al.* [5], to understand the expected range of Da for trace contaminants in natural streams. We limited the comparison to results that met the following criteria:

- profiles of first-order solute reactions were reported as a function of depth in the hyporheic zone,
- no production of mass was inferred (i.e., all values of k(z) were greater than zero),
- k(z) decreased to a nominal value by the deepest measurement location, indicating the presence of a benchic biolayer and an inert sublayer.

For each solute, we determined whether the reported k(z) was best approximated by a slab (i.e., constant rate) or by an exponential profile. Profiles that showed a sharp transition to values near k(z) = 0 were considered to be a slab with z = -b equal to the transition depth, and  $k_b$  equal to the arithmetic average of k(z) for all depths above z = -b. For profiles that showed a gradual decrease to near-zero values by the lowest measurement location, we determined  $k_b$ and b by fitting an exponential profile to k(z). If dispersion coefficients and retardation coefficients R were reported as a function of depth, we approximated  $D_h$  as a constant value equal to the harmonic mean of  $D_h(z)$  measured at all depths above z = -b [6]. Similarly, we approximated a constant R as the arithmetic average of all R above z = -b. For consistency with our model assumptions, advective velocities reported in the biolayer were set to zero, meaning Da estimates are biased slightly higher than in conditions reported since downwelling conditions in this study suggest a shorter residence time in the biolayer. We calculated Da as

$$Da = \frac{k_b b^2}{RD_h}$$

All values are reported in Table I. These values span a wide range of effective streambed reactivities, as shown in Figure S1.

#### Table I: Literature values of Da

Chemical	Source	$\stackrel{D_h}{(\times 10^{-6} \text{ m}^2 \text{ s}^{-1})}$	R	profile shape	$k_b (\times 10^{-4} \text{ s}^{-1})$	$\substack{b(\times 10^{-2} \\ \mathrm{m})}$	Da
metoprolol	Schaper et al., 2019	1.0	4.5	$\exp$	16.1		$5.5 \times 10^{+01}$
gabapentin	Schaper et al., 2019	1.0	1.4	$\exp$	6.8		$1.3 \times 10^{+01}$
gabapentin-lactam	Schaper et al., 2019	1.0	1.3	slab	0.8		$2.8 \times 10^{-01}$
valsartan	Schaper et al., 2019	1.0	1.9	$_{\rm slab}$	1.7		$8.1 \times 10^{-01}$
sotalol	Schaper et al., 2019	1.0	1.9	$\exp$	3.7		$8.0 \times 10^{+00}$
metformin	Schaper et al., 2019	1.0	15.3	$\exp$	1.9		$4.3 \times 10^{+02}$
guanylurea	Schaper et al., 2019	1.0	2.6	$\exp$	4.0		$3.6 \times 10^{+01}$
benzotriazole	Schaper et al., 2019	1.0	4.0	$\exp$	2.8		$2.4 \times 10^{+01}$
4-formylaminoantipyrine	Schaper et al., 2019	1.0	2.4	slab	1.5		$9.3 \times 10^{-01}$
methylbenzotriazole	Schaper et al., 2019	1.0	3.3	$\exp$	1.5		$1.5 \times 10^{+01}$
can desartan	Schaper et al., 2019	1.0	1.7	slab	1.7		$7.2 \times 10^{-01}$
olmesartan	Schaper et al., 2019	1.0	1.4	slab	1.3	5.0	$4.6 \times 10^{-01}$
tramadol	Schaper et al., 2019	1.0	2.2	slab	0.5		$3.0 \times 10^{-01}$
carbamazepine	Schaper et al., 2019	1.0	3.6	slab	0.2	5.0	$1.8 \times 10^{-01}$
dihydroxy-carbamazepine	Schaper et al., 2019	1.0	2.2	$\exp$	0.9	10.5	$2.3 \times 10^{+00}$
diatrizoic acid	Schaper et al., 2019	1.0	1.1	slab	0.3		$8.6 \times 10^{-02}$
dissolved organic carbon	Schaper et al., 2019	1.0	1.0	$\exp$	1.1	16.4	$3.1 \times 10^{+00}$

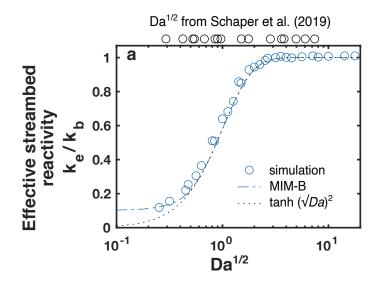


Figure S1: Measured and modeled reactivity across simulations and scales. Results closely match the approximation  $k_e/k_b = \tanh(\sqrt{Da})^2$ , as described in the main text.

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