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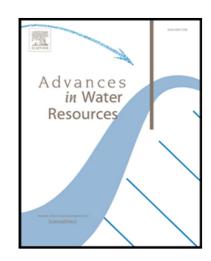
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Relevance of MRMT models to reactive transport

1 Highlights

- Generic models of concentration variability in diffusion-dominated porosities.
- Mobile/immobile models like MRMT are relevant for concentration mean and variance.
- Combinations of porosities in MRMT inherently conserve concentration variance.
- Equivalent MRMT models approximate well homogeneous and heterogeneous reactivities.
- Equivalent MRMT should be of the same minimal dimension as the input/output system.



Inherent relevance of MRMT models to concentration variance and mixing-induced reactivity

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Abstract

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- Several anomalous transport approaches have been developed to model the interaction between
- fast advectively-dominated transport in well-connected porosity and fracture structures and slow
- diffusively-dominated transport in poorly-connected or low-permeability ones. Among them, the
- 19 Multi-Rate Mass Transfer approach (MRMT) represents the anomalous dispersion along the main
- 20 flow paths (mobile zone) induced by a large distribution of first-order exchanges with immobile
- 21 zones. Even though MRMTs have been developed for conservative transport processes in the mo-
- 22 bile zone, we demonstrate that they also conserve the variance of the concentration distribution
- 23 in the immobile zones, and, hence, pertain to mixing induced reactivity. This property is estab-
- 24 lished whatever the organization of the immobile zones and whatever the injection and sampling
- 25 conditions in the mobile zone. It inherently derives from the symmetry properties of the diffu-
- 26 sion operator in the immobile zones, but cannot be directly extended to heterogeneous dispersive
- 27 processes in the mobile zone.
- 28 Keywords: Anomalous transport, Reactive transport, Multi-Rate Mass Transfer models,
- 29 Heterogeneous geological media

30 Highlights

- 31 1. Generic models of concentration variability in diffusion-dominated porosities.
- 2. Mobile/immobile models like MRMT are relevant for concentration mean and variance.
- 33. Combinations of porosities in MRMT inherently conserve concentration variance.
- 4. Equivalent MRMT models approximate well homogeneous and heterogeneous reactivities.
- 5. Equivalent MRMT should be of the same minimal dimension as the input/output system.

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Relevance of MRMT models to reactive transport

1. Introduction

Dispersion in geological media derives from simple advective and diffusive processes in complex porous and fracture structures [Gelhar and Axness, 1983]. Solutes are delayed by trapping in poorly connected porosity structures and dispersed by exchanges with fast transport in localized channels. Such structures are found as intragranular clay particles [Scheibe et al., 2013], stagnant zones in carbonates [Bijeljic et al., 2013], poorly connected fracture clusters [Davy et al., 2010], hydraulic dead ends in fractures [Park et al., 2003] or incomplete dissolution patterns [Luquot et al., 2014]. Diffusion and trapping are significant and may induce non-Fickian anomalously slow and highly-dispersed transport [Bouchaud and Georges, 1990; Dentz and Berkowitz, 2003; Havlin and Ben-Avraham, 1987]. Anomalous transport has been reported both in porous and in fractured media at multiple scales from laboratory experiments [Soler-Sagarra et al., 2016; Zinn et al., 2004; Knorr et al., 2016], advanced analysis of microtromography images [Gjetvaj et al., 2015; Gouze et al., 2008], field experiments [Greskowiak et al., 2011; Le Borgne and Gouze, 2008] and numerical simulations [de Dreuzy and Carrera, 2016; Fernandez-Garcia et al., 2009; Lichtner and Kang, 2007; Roubinet et al., 2013; Willmann et al., 2010].

- Several conceptual frameworks have been developed to model anomalous transport [Benson et al., 2000; Berkowitz et al., 2006; de Dreuzy and Carrera, 2016; Neuman and Tartakovsky, 2009].

 Among them, the mobile-immobile Multi-Rate Mass Transfer models (MRMT) [Carrera et al., 1998; Haggerty and Gorelick, 1995] does not only propose efficient characterization and upscaling methodologies [Willmann et al., 2008; Babey et al., 2015; Rapaport et al., 2017] but also a natural bridge to equivalent concentration distributions, which relevance can be assessed to model reactive transport [Donado et al., 2009; Henri and Fernandez-Garcia, 2015; Sanchez-Vila et al., 2010; Soler-Sagarra et al., 2016]. Synthetic experiments have shown that MRMT models provide close approximations of bulk reactivity even in non-linear equilibrium and kinetically-controlled cases [Babey et al., 2016]. This has been linked to the empirical observation that MRMT models do not only conserve mass by construction but also the porosity weighted integral of concentrations squared [de Dreuzy et al., 2013], which is directly linked to mixing-induced reactivity through the scalar dissipation rate [Le Borgne et al., 2010].
- While the conservation of the porosity weighted integral of concentrations squared has so far been reported from numerical experiments in a couple of specific cases, we provide here the full demon-

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stration of its conservation. This property is inherent to the formalism of the mobile/immobile models (including MRMT) providing the model to be minimal. It derives from the conservation of mass in the mobile zone and from the expression of the immobile concentrations as the direct difference between immobile and mobile concentrations. It does not require any additional condition. The demonstration applies to any type of diffusively-dominated porosity structure exchanging with advectively-dominated transport identified with the so-called mobile zones. We shortly discuss the implications on the general relevance of MRMT models to chemical transport.

2. Dynamics of concentrations in mobile/immobile models

In this section, we recall the general framework proposed by Babey et al. [2015] to model solute transport resulting from the interactions between a mobile zone and a finite number of n immobile zones. This framework identified as the Structured Interacting Continua (SINC) model was introduced as an extension of the classic Multiple Interacting Continua (MINC) model [Pruess and Narasimhan, 1985; Karimi-Fard et al., 2006]. Transport is dominated by advection along the "mobile zone", and solutes are exchanged by diffusion with and between the different "immobile zones". Immobile zones can display any connectivity patterns coming, for example, from the discretization of diffusion within dead-ends of fractures or pore clusters [Davy et al., 2010; Gouze et al., 2008; Karimi-Fard and Durlofsky, 2016], alluvial architectures [Zhang et al., 2013, 2014], heterogeneous porous media [Li et al., 2011; Tyukhova et al., 2015; Tyukhova and Willmann, 2016] or multi-porosity reservoirs [Geiger et al., 2013]. The SINC model is formalized as:

$$\frac{\partial C}{\partial t} + \Phi^{-1}MC = BL(c_1) \tag{1}$$

where C is the column vector made up of the solute concentrations in the mobile and immobile zones:

$$C = [c_1(r,t) \dots c_{n+1}(r,t)]^T.$$
 (2)

 $c_1(r,t)$ is the concentration in the mobile zone and $c_i(r,t)$ with i=2...n+1 are the concentrations in the n immobile zones. L is the advective-dispersive transport operator in the mobile zone:

$$L(c_1) = -\frac{1}{\phi_1} \nabla \cdot (qc_1) + \nabla \cdot (D_m \nabla c_1)$$
(3)

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- where ϕ_1 , q and D_m are the uniform porosity, Darcian flow and diffusion-dispersion tensor in the mobile zone. B is the restriction vector to the mobile zone:
 - $B = \begin{bmatrix} 1 & 0 & \dots & 0 \end{bmatrix}^T. \tag{4}$
- Φ is the porosity matrix of size (n + 1, n + 1) which diagonal coefficients are the porosities of the different zones $φ_i$:

$$\Phi = \operatorname{diag}\left(\left[\begin{array}{ccc} \phi_1 & \dots & \phi_{n+1} \end{array}\right]\right). \tag{5}$$

Finally, the matrix M of size (n+1,n+1) is the operator describing the diffusive-like exchanges between the different zones. M can be compared to a weighted adjacency matrix [Godsil and Royle, 2001] as its coefficients correspond to rates of mass exchanges. Because it expresses a diffusion process, M is a symmetric M-matrix which rows sum to zero. Eq. 1 can be rewritten to highlight the interactions between the concentrations of the different zones:

$$\frac{\partial C}{\partial t} - AC = BL(c_1) \tag{6}$$

where A is the interaction matrix that synthesizes porosity and diffusive mass exchange effects:

$$A = -\Phi^{-1}M. (7)$$

- Except in the specific case of uniform porosity, A is not symmetric.
- MRMT models with a finite number of immobile zones can be expressed within the SINC framework as the subset of models with only mobile-immobile connections, with the corresponding porosity and mass exchange matrices Φ and M given by:

$$\Phi = \operatorname{diag} \left([\phi_1 \dots \phi_{n+1}] \right)
M(i,j) = 0 \text{ for } i > 1, j > 1 \text{ and } i \neq j
M(i,1) = M(1,i) = -\phi_i \alpha_{i-1} \text{ for } i > 1
M(i,i) = -\sum_{j,j\neq i} M(i,j)$$
(8)

where α_i and ϕ_i are the rates of exchanges and porosities of the MRMT model Haggerty and Gorelick [1995].

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3. Conservation of concentration variance by MRMT models

Babey et al. [2015] and Rapaport et al. [2017] have demonstrated that any mobile-immobile model identified as SINC in the previous section, i.e. whatever the connectivity of its immobile zones, is equivalent to a unique (up to the numbering of the immobile zones) MRMT model, proving the original model to be minimal. Equivalence between SINC and MRMT is meant here as the same number of immobile zones and the same partition of concentrations between the mobile and immobile zones:

$$c_1(r,t) = \bar{c}_1(r,t) \tag{9}$$

$$\sum_{i=2}^{n+1} \phi_i c_i(r,t) = \sum_{i=2}^{\bar{n}+1} \bar{\phi}_i \bar{c}_i(r,t)$$
(10)

where c_i , ϕ_i and n are respectively the concentrations, porosities and total number of immobile zones for SINC, and \bar{c}_i , $\bar{\phi}_i$ and \bar{n} are their counterparts for the equivalent MRMT model.

When the original SINC model is not minimal, the variance of concentration is not conserved as 114 shown by the counterexample of Appendix A1. The absence of minimality cannot be detected with 115 any straightforward criterion as it concerns the exchanges of the overall immobile structure with 116 the mobile zone. The example of Appendix A1 does not show any visual symmetry or redundant 117 structure although it is not minimal. Minimality of the system can however be tested by its 118 controllability and observability properties [Andréa-Novel and de Lara, 2013] (here observability is 119 equivalent to controllability because input and output are in the same mobile zone: see [Rapaport 120 et al., 2017]). A system is said controllable if, for all couple of state vectors (C^a, C^b) , there exists a 121 finite time $T \geq 0$ and a input concentration $c_1^{in}(\cdot)$ defined on [0,T] such that, applying this input 122 function, the solution $C(\cdot)$ with initial condition $C(0) = C^a$ satisfies $C(T) = C^b$. Controllability 123 is checked by the algebraic condition that the controllability matrix given by

$$C = [B, AB, \dots A^n B] \tag{11}$$

is full rank. The lack of minimality means that there is some redundancy in the SINC structure in terms of exchange terms (see example in Appendix A1). When the original model is non minimal, it is however possible to reduce the model to an equivalent minimal one ([Chen, 1999]), which can

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be sought here as a SINC model with less immobile zones ($\bar{n} < n$) before applying the algorithm given in [Rapaport et al., 2017] to then obtain an equivalent MRMT model with \bar{n} immobile zones.

After recalling how MRMT models can be built from minimal SINC models, we show that MRMT models inherently preserve the porosity weighted integral of the concentrations squared:

$$\sum_{i=1}^{n+1} \phi_i c_i^2 = \sum_{i=1}^{\bar{n}+1} \bar{\phi}_i \bar{c}_i^2 \tag{12}$$

or equivalently in algebraic form:

$$C^T \Phi C = \bar{C}^T \bar{\Phi} \bar{C} \tag{13}$$

with C and Φ the concentration vector and diagonal porosity matrix for SINC, and \bar{C} and $\bar{\Phi}$ their counterparts for the equivalent MRMT model.

Assuming the identity of concentration partition (Eqs. 9-10), the equivalent MRMT model to a SINC model writes:

$$\frac{\partial \bar{C}}{\partial t} - \bar{A}\bar{C} = BL(c_1) \tag{14}$$

where \bar{A} and \bar{C} are the interaction matrix and concentration vector for the equivalent MRMT model:

$$\begin{cases} \bar{A} = RAR^{-1} \\ \bar{C} = RC \end{cases} \tag{15}$$

with R the transformation matrix from SINC to MRMT. Concentrations \bar{C} are qualified as semilocal as they are still concentrations from the dimension point of view but are only combinations of effective concentrations C. R derives from the diagonalization of the sub-matrix $A_S = A(2:$ n+1,2:n+1), which describes exclusively the exchanges between the immobile zones, into $\bar{A}_S = \bar{A}(2:n+1,2:n+1)$:

$$\bar{A}_S = R_S A_S R_S^{-1} \tag{16}$$

where R_S is the matrix composed of the eigenvectors of A_S . The eigenvalues of A_S (diagonal coefficients of \bar{A}_S) are the rates α_i of the equivalent MRMT model (Eq. 8). To be representative

of a MRMT model, \bar{A} must have the same shape as A described by Eq. 7:

$$\bar{A} = -\bar{\Phi}^{-1}\bar{M} \tag{17}$$

where $\bar{\Phi}$ and \bar{M} are the porosity and mass exchange matrices given by Eq. 8. Rapaport et al. [2017] have shown that this condition is fulfilled only if the pair (A, B) is controllable. The full transformation matrix R then writes:

$$R = \begin{bmatrix} 1 & 0 \\ 0 & -R_S \bar{A_S}^{-1} \operatorname{diag} \left(R_S^{-1} A(2:n+1,1) \right) \end{bmatrix}.$$
 (18)

R verifies the conservation of concentrations in the mobile zone (Eq. 9). By construction, R also ensures that any uniform concentration profile in SINC remains equally uniform in its equivalent MRMT:

$$\begin{bmatrix} 1 \\ \vdots \\ 1 \end{bmatrix} = R \begin{bmatrix} 1 \\ \vdots \\ 1 \end{bmatrix}. \tag{19}$$

From this formulation of the equivalence between SINC and MRMT, we derive the expressions of $\bar{\Phi}$ and \bar{M} as functions of $\bar{\Phi}$ and M and of the transformation matrix R. To this end, we develop the expression of \bar{A} in Eq. 15 by introducing the definition of A (Eq. 7):

$$\bar{A} = -R\Phi^{-1}MR^{-1},\tag{20}$$

and introduce the matrices $T=R\Phi^{-1/2}$ and $S=\Phi^{-1/2}M\Phi^{-1/2}$ such that

$$\bar{A} = -TST^{-1}$$

= $-TT^{T}(T^{-1})^{T}ST^{-1}$. (21)

We note T_S and S_S the sub-matrices of T and S made up of their last n rows and columns. As \bar{A}_S is diagonal, T_S diagonalizes the matrix S_S :

$$T_S S_S T_S^{-1} = R_S A_S R_S^{-1} = \bar{A}_S \tag{22}$$

and, because S_S is symmetric, and \bar{A}_S has distinct eigenvalues, T_S is of the form DU where D is a diagonal matrix and U is a unitary matrix. $T_ST_S^T$ is in turn equal to a positive diagonal matrix

 D^2 . Due to the structure of the matrix R, one has:

$$TT^T = \begin{bmatrix} 1/\phi_1 & 0\\ 0 & T_S T_S^T \end{bmatrix}. (23)$$

Because TT^T is positive and diagonal, and because $(T^{-1})^TST^{-1}$ is symmetric, they can be identified respectively to $\bar{\Phi}^{-1}$ and \bar{M} of Eq. 17:

$$\bar{\Phi} = (TT^T)^{-1} = (R^{-1})^T \Phi R^{-1}$$
(24)

$$\bar{M} = (T^{-1})^T S T^{-1} = (R^{-1})^T M R^{-1}.$$
 (25)

It should be noted that the transformations of porosities and mass exchange rates from SINC to MRMT are identical and directly derive from the change of basis of the concentrations given by Eqs. 15, 18 and 19. The conservation of the porosity weighted integral of concentrations squared of Eq. 13 derives from the consistency between the change of basis of concentrations and porosities (Eqs. 15 and 24):

$$\bar{C}^T \bar{\Phi} \bar{C} = C^T R^T (R^{-1})^T \Phi R^{-1} R C$$

$$= C^T \Phi C.$$
(26)

As this conservation directly results from the construction of MRMT without any additional con-169 straint, it is an inherent property of MRMT models of finite dimension (i.e. having a finite number 170 of immobile zones). It fundamentally derives from the symmetry of the exchange matrix M of 171 the mobile-immobile model, a fundamental property of the diffusion operator, which conditions 172 the orthogonality of the matrix T, a property essential to the demonstration. The conservation of 173 the porosity weighted integral of concentrations squared can be extended to all porosity structures 174 that are equivalent to the same MRMT, i.e. that have the same mobile concentrations (Appendix 175 A2). 176

The same conservation of the porosity-weighted sum of concentrations squared can also be established for the uniform radial diffusion in the immobile zone whatever its dimension (1, 2 or 3), where the equivalent MRMT derives from a separation of variables methodology [Haggerty and Gorelick, 1995; Carrera et al., 1998]. As the former demonstration requires the number of immobile zones to be finite, we provide for an alternative demonstration in Appendix A3. we

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show that this conservation derives again from the symmetry of the diffusion operator. In fact, the orthogonality of the basis function of the diffusion equation in radially uniform media removes cross products between basis functions. Proper choice of eigenvector normalization also derives from the conservation of uniform concentration profiles as in Eq. 19.

6 4. Discussion and conclusions

Eqs. 10 and 12 show that the first and second moments of the concentration distribution in the immobile zones are conserved in the passage from the porosity structure to its equivalent MRMT model. This result pertains to any organization of the immobile zones and any injection conditions. It is also valid whether the initial porosity organization is described by continuous or discrete formalisms, as long as injection and sampling are carried out exclusively in the mobile zone. This is typically the case in tracer tests where tracers are injected into and collected from the flowing/mobile zone.

As both the first and second moments of the concentration distribution in the immobile zones are 194 conserved in MRMT, so is the concentration variance and, hence, the scalar dissipation rate that 195 strongly conditions mixing-induced reactivity [Le Borgne et al., 2011]. In fact, the reaction rate can 196 be expressed as the product of the scalar dissipation rate by a chemical term, which depends on the 197 nature of the reaction [De Simoni et al., 2005, 2007; Rubin, 1983]. For advective-diffusive transport 198 without solute flux across boundaries, the scalar dissipation rate is inversely proportional to half of 199 the second moment of the concentration distribution [Le Borgne et al., 2010]. Larger concentration 200 variances result in stronger mixing potential between higher and lower concentration values and 201 promote homogeneous reactivity (reactivity in solution). By reducing concentration variances, 202 diffusive processes induced by mobile-immobile mass exchanges thus promote reactivity and, by consequence, reduce further mixing and reaction potentials. 204

The scalar dissipation rate only differs from the reaction rate by a chemical term that derives from
the nonlinearity of the reactivity in the reactant concentrations [De Simoni et al., 2005]. Numerical simulations have however shown that the influence of this chemical term remains limited for
most immobile porosity structures and reaction types also extending to heterogeneous reactivity
including sorption and precipitation/dissolution [Babey et al., 2016]. The relevance of MRMT
to model reactive transport fundamentally comes from the representativity for the concentration

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distribution of its mean and variance in diffusively-dominated conditions. Although concentration distributions are more complex than Gaussian, they do not differ much and lead to close approximations. As diffusion further smoothens concentration profiles, approximations become even closer with time.

Use of Multi-Rate Mass Transfer models for reaction rate predictions benefits from the development of different numerical approaches proposed for extending classical advection dispersion schemes in 216 the mobile zone to account for exchanges with immobile zones. Approaches have been proposed based either on Eulerian schemes [Silva et al., 2009] or Lagrangian schemes [Noetinger et al., 218 2016; Roubinet et al., 2013. They may be used to assess the concentration distribution and the associated reactivity rate either in a postprocessing step when transport and reactivity can be 220 fully decoupled [Donado et al., 2009; Willmann et al., 2010] or with classical sequential or global implicit coupling methods otherwise [de Dieuleveult et al., 2009; Steefel et al., 2005]. Concentration 222 gradients necessary for computing local reactivity rates may be obtained directly with appropriate schemes [Beaudoin et al., 2017] or eventually derived from finite-differencing the concentration 224 field. 225

While diffusive processes in poorly connected porosity structures smoothen concentration gradi-226 ents, dispersive processes modeled at the fundamental scale of the spatial and temporal variabilities of the velocity field will tend, on the contrary, to retain concentration differences [Le Borgne et al., 228 2011; de Dreuzy et al., 2012. When diffusive and dispersive processes occur in the same domain like in strongly heterogeneous porous media [Delhomme, 1979], mixing eventually results from the 230 interplay between the spatial and temporal fluctuations of the velocity field at the origin of dispersion and the diffusive exchanges in the least pervious zones [de Dreuzy et al., 2012; Pool et al., 232 2015. Multi-Rate Mass Transfer models inherently built for diffusive processes no longer hold to model dispersion [de Dreuzy and Carrera, 2016] and other dynamic analysis of the concentration 234 field based for examples on lamellas deformed by the velocity fluctuations may be used to approximate the concentration field [Le Borgne et al., 2015]. Further research is thus needed to explore 236 the overall effect of combined dispersion and exchanges with diffusive zones.

In the restrictive case where macroscopic dispersion is dominantly induced by exchanges between advective and diffusive zones, conservative tracer testing already contains most of the information

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necessary to evaluate the physical control of reactivity. Simple breakthrough curves are sufficient to calibrate MRMT models and produce predictions of the immobile concentration distribution, and reactive transport can be approached by simply coupling MRMT models with the targeted

244 Acknowledgments

reactive processes.

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47 Appendix A1: Controllability of diffusive porosity structures

In this example, we show how the lack of controllability and minimality precludes the conservation of the concentration variance. We consider four zones with the porosities $\phi_1 = 1$, $\phi_2 = 1$, $\phi_3 = 2$, $\phi_4 = 3$ and the exchange coefficients (coefficients of the matrix M of Eq. 1) $m_{12} = 1$, $m_{13} = 2$, $m_{14} = 3$, $m_{23} = 3$, $m_{24} = 3$. The first zone is the mobile zone, the three other ones are immobile zones. The sum of the concentrations squared weighted by the porosities is

$$\Sigma = C^t \Phi C = C_1^2 + C_2^2 + 2C_3^2 + 3C_4^2. \tag{27}$$

The PDE of Eq. 6 can be written at a given position along the mobile zone as an input-output representation such as:

$$\frac{dC}{dt} = AC + BC_{in}, \quad C_{out} = B^T C$$
(28)

where C_{in} , C_{out} are respectively the input and output concentrations. Only advection is considered in the mobile zone. In the specific case considered A and B are given by:

$$A = \begin{bmatrix} -7 & 1 & 2 & 3 \\ 1 & -7 & 3 & 3 \\ 1 & \frac{3}{2} & -\frac{5}{2} & 0 \\ 1 & 1 & 0 & -2 \end{bmatrix}, \qquad B = \begin{bmatrix} 1 \\ 0 \\ 0 \\ 0 \end{bmatrix}$$

$$(29)$$

At first look, this structure does not exhibit any special property or symmetry that could make believe that the input-output system is non minimal. The pair (A, B) is however non controllable, even though one can check that the sub-matrix A(2:4,2:4) has distinct eigenvalues. It can be shown that:

$$AB = \begin{bmatrix} -7 \\ 1 \\ 1 \\ 1 \end{bmatrix}, A^{2}B = \begin{bmatrix} 55 \\ -8 \\ -8 \\ -8 \\ -8 \end{bmatrix} = -B - 8AB \tag{30}$$

and that the rank of the matrix C defined in Eq. (11) is 2, where it should be full ranked. Therefore, the system admits a minimal representation of dimension only 2. The equivalent immobile zone

263 can be found by merging the immobile zones in one with a porosity

$$\bar{\phi} = \phi_2 + \phi_3 + \phi_4 = 6 \tag{31}$$

264 and an equivalent concentration

$$\bar{C} = \frac{\phi_2 C_2 + \phi_3 C_3 + \phi_4 C_4}{\bar{\phi}} = \frac{C_2 + 2C_3 + 3C_4}{6}.$$
 (32)

One can check that (C_1, \bar{C}) is solution of the differential system:

$$\frac{d}{dt} \begin{bmatrix} C_1 \\ \bar{C} \end{bmatrix} = \begin{bmatrix} -7 & 6 \\ 1 & -1 \end{bmatrix} \begin{bmatrix} C_1 \\ \bar{C} \end{bmatrix} + \begin{bmatrix} 1 \\ 0 \end{bmatrix} C_{in}, \quad C_{out} = C_1$$
(33)

that provides an equivalent input-output system. The sum of the concentrations squared weighted

by the porosities in the equivalent representation is:

$$\bar{\Sigma} = C_1^2 + \bar{\phi}\bar{C}^2 = C_1^2 + \frac{(C_2 + 2C_3 + 3C_4)^2}{6}$$
(34)

which differs from Σ , because here the original representation is not minimal.

Indeed, the matrix R given in Eq. 18 is in this example:

$$R = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

$$(35)$$

270 which fails to be a transformation matrix to MRMT. One has

$$R_S = \begin{bmatrix} 0.8626094 & -0.4492446 & -0.4133648 \\ -0.2886751 & -0.5773503 & -0.8660254 \\ -0.0600512 & -0.6918374 & 0.7518886 \end{bmatrix}$$
(36)

that diagonalizes the sub-matrix A_S :

$$R_{S} \begin{bmatrix} -7 & 3 & 3 \\ \frac{3}{2} & -\frac{5}{2} & 0 \\ 1 & 0 & -2 \end{bmatrix} R_{S}^{-1} = \begin{bmatrix} -8.2603986 & 0 & 0 \\ 0 & -1 & 0 \\ 0 & 0 & -2.2396014 \end{bmatrix}$$
(37)

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but the vector

$$R_S^{-1}A(2:4,1) = \begin{bmatrix} 0\\ -1.7320508\\ 0 \end{bmatrix}$$
 (38)

has null entries. In [Rapaport et al., 2017], it is proved that for matrices of the form of Eq. (7) the vector $R_S^{-1}A(2:n+1,1)$ has non-null entries exactly when the pair (A,B) is controllable. 274

One may argue that having the pair (A, B) non controllable is a very particular and rare case (as the property of having a singular controllability matrix of Eq. (11) is non-generic in the set of 276 matrices A of the form of Eq. (7)), but the distance to uncontrollability (see [Eising, 1984]) 277

$$\tau(A,B) = \min_{\lambda \in \mathbb{C}} \sigma_n([A - \lambda I, B])$$
(39)

 $\tau(A,B) = \min_{\lambda \in \mathbb{C}} \sigma_n([A - \lambda I, B])$ (39) (where $\sigma_n([A - \lambda I, B])$ denotes the smallest singular value of the augmented matrix $[A - \lambda I, B]$) 278 gives a "measure" of how far the original model can be from a non-minimal representation (having 279 thus some entries of the vector $R_S^{-1}A(2:n+1,1)$ possibly close to 0). Moreover, it is shown 280 in [Rapaport et al., 2017] how to exploit the transformation to a MRMT structure for minimal 281 representations that are close to non-minimal ones to obtain reduced MRMT models of smaller 282 dimension. 283

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Appendix A2: Conservation of concentrations squared between equivalent SINC models

We show that the conservation of concentrations squared can be generalized to all SINC models that are equivalent in the sense of Haggerty and Gorelick [1995] (i.e. identity of the mobile concentrations). Consider two equivalent SINC models given by their interaction matrices A and Z. Each of these two SINC admits an equivalent MRMT model given by Eq. 14. Being equivalent (and the pairs (A, B) and (Z, B) being controllable), the two MRMT configurations are identical, up to the numbering of the immobile zones. So there exist two transformation matrices R_A and R_Z from SINC to MRMT such that (Eq. 15):

$$R_A A R_A^{-1} = \bar{A} = R_Z Z R_Z^{-1}. \tag{40}$$

Eq. 26 implies the conservation of the porosity weighted integral of concentrations squared:

$$C_A^T \Phi_A C_A = \bar{C}^T \bar{\Phi} \bar{C} = C_Z^T \Phi_Z C_Z \tag{41}$$

where C_A and Φ_A are respectively the concentration vector and the diagonal porosity matrix associated with A, and C_Z and Φ_Z are their counterparts for Z. The relationships between these quantities can be further expressed through the transformation matrix R_{AZ} that transforms the SINC model given by A into the SINC model given by Z:

$$\begin{cases} C_Z = R_{AZ}C_A \\ \Phi_Z = (R_{AZ}^{-1})^T \Phi_A R_{AZ}^{-1} \end{cases} \text{ with } R_{AZ} = R_Z^{-1} R_A.$$
 (42)

Appendix A3: Conservation of the weighted sum of concentrations squared in planar, cylindrical and spherical inclusions

The general equation for mobile-immobile models with diffusion into planar, cylindrical or spherical continuous immobile inclusions writes [Haggerty and Gorelick, 1995]:

$$\frac{\partial c_m}{\partial t} + \beta \frac{\partial \langle c_{im} \rangle}{\partial t} = L(c_m) \tag{43}$$

where c_m is the mobile concentration, $\langle c_{im} \rangle$ is the mean concentration in the immobile domain and β is equal to the ratio of the immobile to mobile total porosities. The solution of the PDE in the immobile domain is given by:

$$c_{im}(r,t) = \sum_{i=1}^{\infty} a_i \frac{f(\sqrt{\alpha_i}r)}{\|f(\sqrt{\alpha_i}r)\|^2} e^{-\alpha_i t}$$
(44)

305 with

$$a_i = \int_0^1 r^{n-1} c_{im}(r,0) f(\sqrt{\alpha_i}r) dr$$

$$\tag{45}$$

306 and

$$||f(\sqrt{\alpha_i}r)||^2 = \int_0^1 r^{n-1} f^2(\sqrt{\alpha_i}r) dr.$$

$$(46)$$

For the layered (n=1), cylindrical (n=2) and spherical (n=3) cases, the explicit functions and square norm values for Eq. 44 are given in Table 1, and the values of MRMT rates α_i and porosities $\bar{\phi}_i$ are given in Table 1 of [Haggerty and Gorelick, 1995].

n	1	2	3
f(.)	$\cos(.)$	$I_0(.)$	$\sin(.)$
$\left\ f(\sqrt{\alpha_i}r) \right\ ^2$	$\frac{1}{2}$	$\frac{1}{2}I_1^2(\sqrt{\alpha_i}r)$	$\frac{1}{2}$

Table 1: Functions and square norm values of Eq. 44 for n = 1, 2, 3. I_0 and I_1 are the zero-order and first-order modified Bessel functions of the first kind.

By construction, f forms an orthogonal set of functions whatever the dimension of the inclusion. The orthogonality of the function f more generally derives from the theorem of Sturm-Liouville. The Sturm-Liouville theorem states the existence and the orthogonality of the basis function

for second-order linear differential equations, but does not give their analytical expression. The
MRMT model can generally be expressed as:

$$\bar{c}_{im,i}(t) = \sum_{i=1}^{\infty} \bar{c}_{im,i}(t=0)e^{-\alpha_i t}.$$
(47)

The relations between the continuous solutions of Eqs. 43-44 and the MRMT model of Eq. 47 provide constrains on the $\bar{\phi}_i$ and $\bar{c}_{im}(t=0)$:

$$\bar{\phi}_i \bar{c}_{im}(t=0) = \frac{a_i}{\|f(\sqrt{\alpha_i}r)\|^2} \int_0^1 nr^{n-1} f(\sqrt{\alpha_i}r) dr. \tag{48}$$

Complementary relations derive from the identity of concentrations in the mobile zone:

$$\int_{0}^{1} c_{im}(r,t)nr^{n-1}dr = \sum_{i=1}^{\infty} \frac{a_{i}}{\|f(\sqrt{\alpha_{i}}r)\|^{2}} \int_{0}^{1} nr^{n-1}f(\sqrt{\alpha_{i}}r)e^{-\alpha_{i}t}dr.$$
 (49)

These equations should be valid whatever the initial conditions and especially for $c_{im}(r, t = 0) = 1$ which corresponds to $\bar{c}_{im,i}(t = 0) = 1$ for all immobile zones i, like in Eq. 19 and in the Appendix B of [Haggerty and Gorelick, 1995]. In such a case the MRMT porosities $\bar{\phi}_i$ can be straightforwardly identified as:

$$\bar{\phi}_{i} = \frac{1}{n \|f(\sqrt{\alpha_{i}}r)\|^{2}} \left(\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_{i}}r) dr\right)^{2}$$

$$= \frac{1}{n} \frac{\left(\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_{i}}r) dr\right)^{2}}{\int_{0}^{1} r^{n-1} f^{2}(\sqrt{\alpha_{i}}r) dr}$$
(50)

The initial MRMT concentrations are given by:

$$\bar{c}_{im,i}(t=0) = \frac{\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_i}r) c_{im}(r,t=0) dr}{\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_i}r) dr}.$$
 (51)

 $\bar{c}_{im,i}(t=0)$ is simply some normalized scalar product of the initial condition $c_{im,i}(t=0)$ by the basis function corresponding to α_i . The sum of the concentrations squared weighted by the

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porosities Σ for the continuous formulation of the solution writes:

$$\Sigma = n \int_{0}^{1} r^{n-1} c_{im}^{2}(r,t) dr$$

$$= n \sum_{i=1}^{\infty} \frac{a_{i}^{2}}{\|f(\sqrt{\alpha_{i}}r)\|^{4}} e^{-2\alpha_{i}t} \int_{0}^{1} r^{n-1} f^{2}(\sqrt{\alpha_{i}}r) dr$$

$$= n \sum_{i=1}^{\infty} \frac{a_{i}^{2}}{\|f(\sqrt{\alpha_{i}}r)\|^{2}} e^{-2\alpha_{i}t}.$$
(52)

The sum of the concentrations squared weighted by the porosities $\bar{\Sigma}$ in the equivalent MRMT writes:

$$\bar{\Sigma} = \sum_{i=1}^{\infty} \bar{\phi}_{i} \bar{c}_{im,i}^{2}(t=0) e^{-2\alpha_{i}t}$$

$$= \sum_{i=1}^{\infty} \frac{\left(\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_{i}}r) dr\right)^{2}}{n \int_{0}^{1} r^{n-1} f^{2}(\sqrt{\alpha_{i}}r) dr} \frac{n^{2} a_{i}^{2}}{\left(\int_{0}^{1} nr^{n-1} f(\sqrt{\alpha_{i}}r) dr\right)^{2}} e^{-2\alpha_{i}t}$$

$$= n \sum_{i=1}^{\infty} \frac{a_{i}^{2}}{\left\|f(\sqrt{\alpha_{i}}r)\right\|^{2}} e^{-2\alpha_{i}t}$$

$$= \Sigma.$$
(53)

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