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1	Characterizing the Impact of Particle Behavior at Fracture
2	Intersections in Three-Dimensional Discrete Fracture Networks
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Abstract

We characterize the influence of different intersection mixing rules for particle tracking simulations on transport properties through three-dimensional discrete fracture networks. It is too computationally burdensome to explicitly resolve all fluid dynamics within a large three-dimensional fracture network. In discrete fracture network (DFN) models, mass transport at fracture intersections is modeled as a sub-grid scale process based on a local Péclet number. The two most common mass transfer mixing rules are 1) complete mixing, where diffusion dominates mass transfer, and 2) streamline routing, where mass follows pathlines through an intersection. Although, it is accepted that mixing rules impact local mass transfer through single intersections, the effect of the mixing rule on transport at the fracture network scale is still unresolved. Through the use of explicit particle tracking simulations, we study transport through a quasi-two-dimensional lattice network and a three dimensional network whose fracture radii follow a truncated power law distribution. We find that the impact of the mixing rule is a function of the initial particle injection condition, the heterogeneity of the velocity field, and the geometry of the network. Furthermore, our particle tracking simulations show that the mixing rule can particularly impact concentrations on secondary flow pathways. We relate these local differences in concentration to reactive transport and show that streamline routing increases the average mixing rate in DFN simulations.

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15 I. INTRODUCTION

The behavior of fluid flow and the associated transport of dissolved chemicals through low-permeability subsurface rocks is primarily controlled by fracture networks within the medium. Length scales within these networks typically range several orders of magnilude [1] and characterizing the interplay across these length scales has applications in a range of engineering endeavors including CO₂ sequestration technologies [2], geothermal energy extraction [3], unconventional hydrocarbon extraction [4], and the long term storage of spent nuclear fuel [5]. At the network structure scale, connectivity and density control the general behavior of the fluid flow field [6]. Within individual fractures, the location of inflow and outflow boundaries and local variations in the fracture aperture determine the local flow field [7, 8]. However, how fluid moves through the intersections between fractures is also important in terms of local dispersion because intersections are regions of enhanced mixing [9] and can impact network scale spreading of solute [10].

Discrete fracture networks (DFN) are one of the most common modelling tools for simulating flow and transport through fractured media. In the DFN methodology fractures are represented as lower dimensional structures in the domain, lines in two-dimensions and planes in three-dimensions. The choice to explicitly resolve fractures, as opposed to using effective properties in continuum models, allows observations of transport to be linked to the structural properties of the fracture networks. This choice drastically increases the cost of running DFN simulations and certain aspects of the simulation are modelled as sub-grid scale processes.

One such subgrid process is particle behavior within fracture intersections. There have ar been a number of laboratory experiments [9, 11–14] and numerical simulations [15–18] to better understand particle behavior within fracture intersections. The fluid velocity field along fracture intersections is three-dimensional and particle behavior is determined by the combination of the velocity field, the velocity magnitude and diffusion. In a DFN, however, the line of intersection is either a point (2D) or a line (3D) and the true structure of the velocity field is not resolved. In attempts to represent the particle behavior several subgrid processes have been proposed. The two most prominent fracture intersection rules are complete mixing and streamline routing. Particle transport is primarily diffusion controlled with the complete mixing rule and advection dominated with the streamline routing rule. The choice of which process is most appropriate is determined by the local physics of the fracture intersection, characterized by a Péclet number Pe, the ratio of advective to diffusive forces. Assuming complete mixing can be traced to the fracture junction experiments of Wrizek et al. [11], where an inflowing branch intersected with multiple outflowing branches. In these experiments, tracer from the inflow branch entered a junction and was distributed to the multiple outflowing branches, which was interpreted as complete mixing of the tracer within the junction. In a DFN model with a complete mixing subgrid process, particles enter an intersection and are conceptually allowed to jump between streamlines and mix within the intersection due to diffusion. In contrast, the streamline routing mixing rule prohibits solute from crossing streamlines, implying only advection governs transport, representative of a high Pe condition. Laboratory experimental observations of solute trajectories through a single orthogonal intersection with two inflow and two outflow branches [12–14] suggest streamline routing is appropriate when the intersection Pe > O(10).

The aforementioned laboratory studies considered transport through an idealized intersec-59 ⁶⁰ tion that is poorly representative of real geologic geometries. Moreover, they do not consider ⁶¹ the impact of particle behavior along intersections on transport at the fracture and network ⁶² scale. There have been several numerical simulations to address these aspects of DFN mod-⁶³ elling but their conclusions appear to be in disagreement. Park et al. [19] concluded that the ⁶⁴ mixing rule did not significantly impact transport for simulations through two-dimensional 65 networks where fracture lengths were power law distributed and solute enters the domain via ⁶⁶ a point source initial condition. Similarly, Cvetkovic et al. [5] simulated transport through ⁶⁷ a three-dimensional DFN where particles were injected across an inlet plane, and concluded ⁶⁸ that the mixing rule had little impact on transport as quantified by travel time distributions. ⁶⁹ However, Kupper et al. [20], Park et al. [21], and Kang et al. [10] found that for a point ⁷⁰ source initial condition complete mixing can enhance transverse spreading of a solute plume 71 compared to streamline routing for transport through certain two-dimensional lattice cases. ⁷² These studies suggest the impact of the mixing rule depends on the network structure, het-73 erogeneity of the velocity field, dimensionality of the network, and initial injection mode of ⁷⁴ particles. Thus, it is not clear under what conditions the choice of mixing rule at fracture 75 intersections has an impact on different large scale transport features.

⁷⁶ We use DFNWORKS [22] to simulate transport through two different DFN structures ⁷⁷ that represent varying degrees of structural and velocity field heterogeneity and study con⁷⁸ ditions under which the mixing rule is important for transport through large scale fracture ⁷⁹ networks. One network is a quasi-two-dimensional lattice where the apertures are sampled ⁸⁰ from a lognormal distribution and the other is a set of networks composed of circular frac-⁸¹ tures whose lengths are drawn from a power law distribution. In both sets of simulations, ⁸² we consider point injection and flux-weighted injection of particles across the entire inlet ⁸³ plane. The impact of complete mixing and streamline routing is compared in terms of the ⁸⁴ travel time distributions, mean squared displacement, and transverse breakthrough distribu-⁸⁵ tions of solute plumes at uniformly spaced control planes. Additionally, to explore possible ⁸⁶ implications on mixing driven reactions we also compare mixing rates in simulations with ⁸⁷ different implemented fracture intersection mixing rules.

We observe that the impact of the mixing rule depends on the initial injection mode, the fracture network structure, and heterogeneity of the velocity field. The greatest impact on upscaled properties is observed when particles are released from a point source. As theterogeneity of the network structure increases particles tend to channelize at the network scale and the impact of the mixing rule on upscaled behavior decreases. But even in highly heterogenous systems, there are significant differences in transport behavior within fracture planes where in-plane channelization is observed. Specifically, we find that streamline routing increases channelization of mass to secondary fractures, resulting in an increased overall system wide averaged mixing rate and local mixing rates that can differ by up to two or orders of magnitude. This has strong potential implications for reactive transport, mainly in determining how aggressively and where mixing driven reactions will occur [23, 24].

99 II. DISCRETE FRACTURE NETWORK SIMULATIONS

There are a number of methods used to model flow and the associated transport of ¹⁰¹ dissolved chemical species through fractured media in the subsurface including stochastic ¹⁰² continuum [25], dual-porosity / dual-permeability [26], and discrete fracture network models ¹⁰³ (DFN) [27–29]. Here we use the discrete fracture network (DFN) modeling methodology ¹⁰⁴ where individual fractures are represented as planar N - 1 dimensional objects embedded ¹⁰⁵ within an N dimensional space. Each fracture is assigned a shape, location, and orientation ¹⁰⁶ within the domain by sampling distributions whose parameters reflect a site characteriza-¹⁰⁷ tion. The fractures form a network embedded within an impermeable rock matrix; we do not ¹⁰⁸ consider interaction between flow within the fractures and the solid matrix. Each fracture is ¹⁰⁹ meshed for computation and the governing equations for flow and transport are numerically ¹¹⁰ integrated on the network. The choice to use a DFN model rather than a continuum model ¹¹¹ arises due to the focus of this study, which is characterizing the influence of smaller scale ¹¹² processes, namely particle behavior at fracture intersections, on upscaled transport behav-¹¹³ ior. Continuum models do not explicitly represent fractures and their intersections and are ¹¹⁴ therefore unsuitable for the task at hand.

The generation of each discrete fracture network along with flow and transport simu-115 116 lations is preformed using the DFNWORKS suite [22]. DFNWORKS is a high-fidelity DFN ¹¹⁷ modelling suite that has been used in analysis of flow properties in fractured media with scales ranging from millimeters to kilometers and with applications in nuclear waster dis-118 posal [30, 31] and hydraulic fracturing [4, 32]. DFNWORKS combines the feature rejection 119 algorithm(FRAM) [33], the LaGriT meshing toolbox [34], the parallelized subsurface flow 120 and reactive transport code PFLOTRAN [26], and an extension of the WALKABOUT particle 121 tracking method [35, 36]. FRAM is used to generate three-dimensional fracture networks. 122 LaGriT is used to create a computational mesh representation of the DFN in parallel. PFLO-123 ¹²⁴ TRAN is used to numerically integrate the governing flow equations. WALKABOUT is used to ¹²⁵ determine pathlines through the DFN and simulate solute transport. Details of the suite, ¹²⁶ implementation, its abilities, applications, and references are provided in Hyman et al. [22].

127 A. Flow Simulations

¹²⁸ Under the assumption of aperture uniformity within a single fracture, flow therein is ¹²⁹ equivalent to flow between two parallel plates and can be modeled with the Stokes equations, ¹³⁰ the governing equations for low Reynolds number isothermal single phase Newtonian flow. ¹³¹ The Stokes equations can be integrated to determine the volumetric flow rate Q per unit ¹³² fracture width normal to the direction of flow

$$\mathbf{Q} = \frac{-b^3}{12\mu} \nabla P,\tag{1}$$

¹³³ i.e., the Boussinesq equation. Here b is the aperture height and P is pressure. We consider ¹³⁴ an incompressible fluid such that

$$\nabla \cdot \mathbf{Q} = 0 \quad . \tag{2}$$

¹³⁵ Equation 1 and 2, along with boundary and initial conditions, are used to derive an elliptic
¹³⁶ partial differential equation for the steady-state distribution of pressure within a network

$$\nabla \cdot (b^3 \nabla P) = 0. \tag{3}$$

¹³⁷ Once the distribution of pressure and volumetric flow rates are determined by numerically ¹³⁸ integrating (3), the Eulerian velocity field $\mathbf{u}(\mathbf{x})$ within the DFN is reconstructed from the ¹³⁹ volumetric fluxes and pressures following Makedonska et al. [35] and Painter et al. [36]. A ¹⁴⁰ pressure gradient is imposed, which is aligned with the x axis, making this also the primary ¹⁴¹ direction of flow.

142 B. Transport Simulations: Particle Tracking

¹⁴³ We represent the transport of a nonreactive conservative solute in the DFN using passive ¹⁴⁴ tracer particles, i.e., a Lagrangian approach. Particle motion is purely advective within a ¹⁴⁵ fracture and molecular diffusion is only considered in fracture intersections via a subgrid ¹⁴⁶ process. We denote the plume of particles as Ω and consider two different inlet conditions. ¹⁴⁷ The first inlet condition is a point source where all particles are released into a single fracture ¹⁴⁸ close to the center of the inlet plane. In the second inlet condition, particles are spread across ¹⁴⁹ the entire inlet plane and the number of particles at a given location is proportional to the ¹⁵⁰ flux entering the system at the location, i.e., a flux-weighted injection [30, 37, 38].

Each particle has a unique initial position that we denote $\mathbf{a} = (0, y, z)^{\top}$, where the superscript \top indicates the transpose. The trajectory $\mathbf{x}(t; \mathbf{a})$ of a particle starting at \mathbf{a} at time t = 0 is given by the advection equation

$$\frac{d\mathbf{x}(t;\mathbf{a})}{dt} = \mathbf{v}_t(t;\mathbf{a}), \qquad \mathbf{x}(0;\mathbf{a}) = \mathbf{a}, \tag{4}$$

¹⁵⁴ where the Langrangian velocity $\mathbf{v}_t(t; \mathbf{a})$ is given in terms of the Eulerian velocity $\mathbf{u}(\mathbf{x})$ as

$$\mathbf{v}_t(t; \mathbf{a}) = \mathbf{u}[\mathbf{x}(t; \mathbf{a})]. \tag{5}$$

155 The length $\ell(t; \mathbf{a})$ of the trajectory at a time t is

$$\frac{d\ell(t;\mathbf{a})}{dt} = v_t(t,\mathbf{a}). \tag{6}$$

¹⁵⁶ where the Lagrangian velocity is the velocity magnitude $v_t(t, \mathbf{a}) = |\mathbf{v}_t(t, \mathbf{a})|$. The length of ¹⁵⁷ the pathline, ℓ , is used to parameterize the spatial and temporal coordinates of the particle. ¹⁵⁸ Within the domain, we consider uniformly spaced control planes that are perpendicular ¹⁵⁹ to the primary direction of flow. The first arrival time $\tau(x_i; \mathbf{a})$ of a particle at a control ¹⁶⁰ plane located at x_i from the inlet is given by

$$\tau(x_i; \mathbf{a}) = t[\lambda(x_i); \mathbf{a}], \qquad \lambda(x_i) = \inf\{\ell | x_i(\ell; \mathbf{a}) \ge x_i\}.$$
(7)

¹⁶¹ C. Measurements

At every control plane x_i , the first arrival times of the particles (Eq. 7) are combined to 163 obtain the cummulative distribution of travel times for the plume of particles

$$\psi(t, x_i) = \frac{1}{M} \int d\Omega H(t - \tau(x_i, \mathbf{a}))$$
(8)

¹⁶⁴ Here, M is the total mass of all the particles $M = \int d\Omega$ and H(t) is the heavy side function. ¹⁶⁵ We refer to $\psi(t, x)$ as the breakthrough curve. We also compute the transverse spreading ¹⁶⁶ using the distribution of particle positions at each control plane. Denoting the position of ¹⁶⁷ each particle at the control plane x_i as \mathbf{z}_x the transverse breakthrough position distribution ¹⁶⁸ (TBPD) in z is

$$f_{x_i}(z_k) = \frac{1}{M} \int d\Omega \delta(z_k - \mathbf{z}_{x_i}) , \qquad (9)$$

¹⁶⁹ where δ is the Dirac delta function. An analogous equation is used to calculate TBPD in y. ¹⁷⁰ The characteristic spreading of the particle plume in the transverse direction at longitu-¹⁷¹ dinal position x is quantified by the mean squared displacement,

$$MSD_x = \frac{1}{M} \int d\Omega (\overline{\mathbf{z}}_x - \mathbf{z}_x)^2 + (\overline{\mathbf{y}}_x - \mathbf{y}_x)^2, \qquad (10)$$

¹⁷² where $\mathbf{z}_{\mathbf{x}}$, $\mathbf{y}_{\mathbf{x}}$ are vectors of the transverse position for each particle at x and the overline ¹⁷³ denotes the average over all particles.

174 III. PARTICLE BEHAVIOR AT FRACTURE INTERSECTIONS

When a particle arrives at a fracture intersection, both advective and diffusive processes hould govern motion through the intersection. In a purely advective system, particle motion follows the streamlines of the velocity field. However, diffusion enables particles to jump between streamlines and mix. The amount of mixing that occurs in a fracture intersection ¹⁷⁹ is a balance of the strength of advection relative to diffusion which can be characterized by¹⁸⁰ Péclet number

$$Pe = \frac{vL}{2D_m} \,. \tag{11}$$

¹⁸¹ We adopt the Pe definition provided in [15] where v is the average velocity within the ¹⁸² intersection, L is a characteristic diagonal distance across the intersection, and D_m is the ¹⁸³ molecular diffusion coefficient.

The upscaled nature of DFN models prevents the detailed physics that control mass transfer at fracture intersections from being resolved. Instead, subgrid processes are used to model mass transfer through intersections. There are two mixing rules that are commonly applied: 1) complete mixing and 2) streamline routing. These rules are representative of end members associated with diffusion and advective controlled transport, respectively. The choice of which rule to apply should reflect the physics of the intersection, as determined by the *Pe*.

At a fracture intersection, conservation of mass requires that the sum of incoming and ¹⁹² outgoing Darcy fluxes is zero, $\sum_i q_i = 0$. Both mixing rules require knowledge of the Darcy ¹⁹³ outflowing fluxes. The streamline routing rule needs additional information, the position ¹⁹⁴ of the inflow branches relative to each outflow branch and so implementation of complete ¹⁹⁵ mixing at fraction intersections is simpler than streamline routing.

196 1. Complete Mixing

¹⁹⁷ Under complete mixing, particle motion within the intersection is controlled by diffusion. ¹⁹⁸ In this scenario, particles enter an intersection inlet and are conceptually allowed to jump ¹⁹⁹ between streamlines by being re-positioned to any point within the intersection with equal ²⁰⁰ probability. Figure 1 (a) shows mass transfer under the complete mixing rule in a single ²⁰¹ orthogonal intersection where all branches have an equivalent discharge magnitude. Light ²⁰² blue mass from the top inlet and red mass from the bottom inlet mix at the intersection ²⁰³ and are distributed equally between the two outflowing branches. Each outlet contains mass ²⁰⁴ from both inlets, represented by the outflowing purple color in the figure.

With complete mixing the probability a particle exits a given outlet is proportional to the outlet flux, mathematically represented as,



FIG. 1. A fracture intersection with two inflow branches and two outflow branches. All branches have equivalent discharge magnitudes. In complete mixing (a) mass from both inlets (red and blue) mix at the intersection and mass is distributed equally to each outlet (purple). In streamline routing (b) incoming red mass from the bottom inlet and blue mass from the top inlet are forced to their respective adjacent fractures and do not mix.

$$p_j = \frac{|q_j|}{\sum_k |q_k|} , \qquad (12)$$

²⁰⁷ where p_j is the probability a particle exits outlet j, and k denotes an outflowing fracture ²⁰⁸ branch.

209 2. Streamline Routing

In the streamline routing rule particle motion through fracture intersections is advection Particles adhere to their respective streamlines through the intersection, as if no mixing occurs within the intersection. Therefore, particle motion depends on the particle's inlet position. The streamline routing rule differs from the complete mixing rule when a fracture intersection has multiple incoming and multiple outflowing branches. In a two fracture intersection there are only two intersection types that have this geometry occurs and b) discontinuous junctions [13].

A continuous junction has two inflowing branches, two outflowing branches, and the 217 ²¹⁸ inflowing branches are adjacent, i.e. lie on different fractures. Figure 1 (b) depicts streamline routing mass transfer through a continuous junction where all branches have equivalent 219 discharge magnitudes. Flow from an inlet is directed to the outflowing adjacent branch. In 220 this case, all mass from each inlet is distributed to the adjacent outflowing branch because 221 there is no mixing within the fracture intersection. In general, the streamline routing rule 222 goes as follows. If discharge from the inlet is less than the adjacent outlet discharge, all 223 mass is directed to the adjacent outlet. If the inlet discharge exceeds the adjacent outlet 224 discharge, conservation of mass requires that the adjacent outlet is filled and excess mass is 225 directed to the other outlet. 226

²²⁷ Consider a particle entering a continuous junction from an inlet with flux q_{in} , which is ²²⁸ adjacent to an outflow branch with flux q_{adj} . The second (opposite) outflow branch lies ²²⁹ on the same fracture as the initial inlet fracture and has flux q_{opp} . The streamline routing ²³⁰ rule dictates that the probabilities of transitioning from the inlet to the adjacent p_{adj} and ²³¹ opposite p_{opp} outflow branches are:

$$p_{adj} = \begin{cases} 1, & q_{adj} \ge q_{in} \\ \frac{q_{adj}}{q_{in}}, & q_{adj} < q_{in} \end{cases}, \quad p_{opp} = 1 - p_{adj} \tag{13}$$

²³² More details on continuous junctions are found in Hull et al. [13].

Discontinuous junctions arise from multiple sources and sinks present in the fracture 233 ²³⁴ network, such as a geothermal field with production and injection wells [13]. In a discontinuous junction inflowing branches are opposite and lay on the same fracture. Hull et al. 235 [13] proposed two distributions of streamline routing through a four branch discontinuous 236 intersection, one equivalent to complete mixing and one where the high discharge inlet is 237 preferentially directed to the high discharge outlet. Philip [39] extended Hull's analysis by 238 finding solutions for Laplace and Stokes flow through the orthogonal intersections. Philip 239 showed that under certain conditions, mainly when there is significant differences in branch 240 discharge magnitudes, using complete mixing for streamline routing can result in significant 241 error. However, Hull's other proposed streamline routing rule, where the high discharge 242 ²⁴³ inlet is preferentially directed to the high discharge outlet, is also prone to error as adja-²⁴⁴ cent streamlines can have opposite directions for a considerable distance. Hence, the theory ²⁴⁵ for streamline routing through discontinuous intersections is still not fully developed. For ²⁴⁶ completeness, we present Hull's second proposed streamline routing rule for discontinuous ²⁴⁷ intersections. In this case, mass from the higher discharge incoming branch q_{in}^{max} is parti-²⁴⁸ tioned to the higher discharge outflowing branch q_{out}^{max} and any excess mass exits the smaller ²⁴⁹ discharge outflowing branch q_{out}^{min} . A particle arriving from the inlet with q_{in}^{max} has outlet ²⁵⁰ transition probabilities given by

$$p_{out}^{max} = \begin{cases} 1, & q_{out}^{max} \ge q_{in}^{max} \\ \frac{q_{out}^{max}}{q_{in}^{max}}, & q_{out}^{max} < q_{in}^{max} \end{cases}, \quad p_{out}^{min} = 1 - p_{out}^{max} \tag{14}$$

²⁵¹ A particle arriving from the weaker inflow branch has transition probabilities:

$$p_{out}^{max} = \begin{cases} \frac{q_{out}^{max} - q_{in}^{max}}{q_{in}^{min}}, & q_{out}^{max} \ge q_{in}^{max} \\ 0, & q_{out}^{max} < q_{in}^{max} \end{cases}, \quad p_{out}^{min} = 1 - p_{out}^{max} \end{cases}$$
(15)

²⁵² We performed simulations using both of Hull's discontinuous streamline routing rules. Re-²⁵³ sults were not effected by different rules due in part to the observation that discontinuous ²⁵⁴ intersections are rare in the systems under consideration. Our presented results are only ²⁵⁵ shown for the case described above.

The occurrence and frequency of triple intersections, where three fractures come together at point, depends on the particular fractured media under consideration. However, these triple intersections do occur regularly in unconstrained stochastically generated DFN, their frequency depends on the fracture length distribution, network density, and fracture family orientation. Thus, from a practical and computational point of view, a rule for particle behavior at these points needs to be adopted in DFN modeling. We apply complete mixing at all triple intersections primarily due to the lack of experimental data concerning flow properties at triple intersections by which to verify appropriate streamline routing rules.

264 IV. RESULTS

265 A. Sample Fracture Networks

We consider flow and transport within two distinct fracture network structures. The first a quasi-two-dimensional lattice network and the second is a set of stochastically generated networks, where fracture radii are sampled from a truncated power law distribution. These ²⁶⁹ two network structures are considered because they display different features that drive ²⁷⁰ flow channelization. The lattice networks have an idealized, regular geometry and flow ²⁷¹ channelization arises from variations in the permeability field. In the truncated power law ²⁷² networks, fracture intersections are less frequent and the geometry of the network drives ²⁷³ flow channelization. In the analysis of results we non-dimensionalize distance with l^* , the ²⁷⁴ maximum fracture radius in the system, and time with τ^* , the time required to traverse l^* ²⁷⁵ traveling at the mean particle velocity.

276 1. Lattice Network

The lattice network is comprised of two sets of 50 parallel 3-dimensional planar fractures, where fractures in each set are spaced one meter apart and intersect fractures of the other sets at a 45° angle. The computational domain has size [32, 1, 16]m in the x, y, z directions. A pressure gradient of 1 MPa is used to drive flow in the x-direction. The imposed pressure field results in a quasi-two-dimensional velocity field because velocity in y is negligible.

Fracture apertures are sampled from a lognormal distribution in accordance with obser-282 vations [40–42]. Each lattice network has a mean aperture $\overline{b} = 10^{-4}$ m and three aperture 283 variance cases are considered, $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$. Twenty-five realizations are generated ²⁸⁵ for each mixing rule and aperture variance combination. For each combination, transport is simulated for both point source and flux weighted initial injections. These simulations 286 are similar to the 2D lattice simulations of Kang et. al [10]. However, in our experiments 287 velocity field heterogeneity is controlled by changing the distribution of aperture sizes and 288 we consider an additional flux weighted initial injection case. The objective of studying 289 this network set is to fix the network structure and focus on the effects of variability at the 290 ²⁹¹ fracture scale.

292 2. Truncated Power-law Network

The second set of networks are composed of disk-shaped fractures whose radii are sampled from a truncated power-law distribution, which is a commonly observed length distribution in field data [1, 43–45]. Bour and Davy [43] showed a power-law distribution accurately captures the wide range of fracture lengths often observed in geological datasets [44, 45]. In ²⁹⁷ our power law networks, fracture radii are sampled from a truncated power-law distribution ²⁹⁸ with exponent α and upper and lower cut-offs of $(R_u; R_0)$

$$R = R_0 \left[1 - \eta + \eta \left(\frac{R_0}{R_u} \right)^{\alpha} \right]^{-1/\alpha},$$
(16)

where η is a random number sampled from a uniform distribution on [0,1]. We choose an exponent $\alpha = 2.1$ and cut-offs $R_0 = 2 R_u = 30$ m based on field data [1, 46]. The networks are not meant to be realizations of the networks reported in [1] and [46], but rather semi-generic fracture networks. Fracture orientations are uniformly random and centers are uniformly distributed throughout the domain. Fracture apertures are positively correlated to their radius, $b = 5 \cdot 10^{-5} \cdot \sqrt{R}$, which controls the hydraulic properties within the fracture. This correlation between fracture size and aperture is common in DFN models [29, 31, 47–50]. The computational domain is a cube with sides of length 100m. We refer to these as truncated power law (TPL) networks.

Ten independent identically distributed network realizations are generated. We stop the generation of the networks once 1000 fractures are accepted into the network. This results in a network that is about 7 times more denser a network at the percolation threshold defined by [7, 51]. This procedure ensures that there is a subnetwork that connects inflow to outflow boundaries. To reduce computational cost, we remove all isolated clusters of fractures, those that that do not connect inflow to outflow boundaries, because they do not contribute to the flow. There are roughly 200 fractures the final networks and the average fracture intensity (P_{32}) : Surface area over total volume) is approximately 0.1. Flow is forced along the x-axis by imposing constant pressure conditions at the inlet and outlet control planes perpendicular (P_{31}) to x. The pressure difference in x across the inflow and outflow boundary is 1MPa.

318 B. Lattice Network Simulations

319 1. Breakthrough Curves: Lattice

Figure 3 shows the cumulative distribution of first passage arrival times (Eq. 8) for the point injection (a) and flux weighted (b) initial conditions. Thick lines (streamline routing) are median breakthrough curves for twenty-five realizations and transparent lines correspond to single realizations. For each realization, solid lines indicate



FIG. 2. One realization of a DFN with fracture lengths drawn from a power law distribution. Fractures are colored by their permeability, which is positively correlated with fracture radius.

³²⁴ streamline routing and dashed lines indicate complete mixing. Colors correspond to different ³²⁵ aperture variances; $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$ are depicted with blue, red, and green, respectively. ³²⁶ As velocity field heterogeneity decreases, breakthrough curve realizations homogenize and ³²⁷ the range of arrival times decreases. In both injection conditions and for all values of $\sigma_{ln(b)}^2$ ³²⁸ there is little impact of the mixing rule on the median observed travel time distributions. ³²⁹ In turn, these results indicate that the mixing rule has no major impact on mean particle ³³⁰ velocities, demonstrated by no significant change in breakthrough curve behavior (Figure ³³¹ 3). Additionally, breakthrough curve realizations are more clustered near the median break-³³² through curve for the flux weighted initial condition, e.g. the range of P_{50} values, the time ³³³ at which 50% of mass has crossed the outlet control plane, decreases with the flux weighted ³³⁴ case.



FIG. 3. Cumulative distribution of first passage arrival times (breakthrough curves) for point injection (a) and flux weighted (b) initial condition. Thick lines are median breakthrough curves for 25 realizations and transparent lines correspond to single realizations. For each realization, a solid lines indicate streamline routing and dashed lines indicate complete mixing. Colors correspond to different aperture variances; $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$ are depicted with blue (steepest slope), red, and green (least steep slope), respectively.

335 2. Solute Spreading: Lattice

Figure 4 shows the spatial evolution of the transverse breakthrough position distribution 336 337 $f_{x_i}(z)$ for simulated flow and transport through single realizations of lattice networks of varying velocity field heterogeneities with a point source injection initial condition. The 338 top row shows $f_{x_i}(z)$ for complete mixing, the middle is for streamline routing and the 339 bottom shows the ratio of streamline routing to complete mixing transverse breakthrough 340 position concentrations. In each column, the streamline routing and complete mixing lattice 341 networks are identical realizations. Colors are the logarithm of the concentration with yellow corresponding to relatively high concentration values and blue corresponding to lower values. In both mixing rule cases, there is more pronounced flow channeling as $\sigma_{ln(b)}^2$ increases due to 344 the formation of paths of lower resistance. We calculate the percent of particles concentrated 345 346 on each fracture at each control plane. As heterogeneity increases from $\sigma_{ln(b)}^2 = 0.1$ to $_{347} \sigma_{ln(b)}^2 = 1$, the largest value of percent particles on a single fracture increases by nearly a ³⁴⁸ factor of 2 at distances greater than $x/l^* > 1$, demonstrating increased flow channelization 349 (results not shown).



FIG. 4. The transverse distribution at sequential control planes through a lattice network with a point injection initial condition for one realization. All lattices have the same mean aperture size. Variance of aperture size is selected from a lognormal distribution and increases from the left to right column. Simulations are completed for complete mixing (row 1) and streamline routing (row 2) intersection rules for the same network realization. Row 3 gives the ratio of streamline routing to complete mixing transverse breakthrough position concentrations. Colorbars show log probabilities (rows 1,2) and absolute ratio values (row 3). Complete mixing enhances particle spreading. As velocity field heterogenity increases, the impact of the mixing rule on particle spreading decreases. The transverse direction z is normalized by half the length the of domain z^* .

³⁵⁰ When complete mixing is used, the particles disperse transversely faster than in this case ³⁵¹ of streamline routing and the plume reaches the lateral boundary of the domain closer to the ³⁵² inlet. By contrast, streamline routing increases channelization, which is most notable at low ³⁵³ values of $\sigma_{ln(b)}^2$. Hence, both streamline routing and increasing velocity field heterogenity ³⁵⁴ increase channelization of particles. The ratio of the streamline to complete mixing TBPD ³⁵⁵ highlights how the evolution of $f_{x_i}(z)$ changes because of the intersection mixing rule. Areas ³⁵⁶ of dark blue have value 0, indicating positions where breakthrough occurred under complete ³⁵⁷ mixing but not streamline routing. The yellow areas through the center of the lattice show ³⁵⁸ fractures where streamline routing increases particle concentration.



FIG. 5. The transverse breakthrough position distribution at each control plane for one realization of the lattice with a flux weighted injection. Simulations are completed for complete mixing (a) and streamline routing (b) intersection rules. Subfigure c gives the ratio of streamline routing to complete mixing transverse breakthrough position concentrations. Colorbars show log probabilities (row a,b) and the absolute ratio (c). $\sigma_{ln(b)}^2 = 0.5$ is the only aperture variance shown because results do not significantly change for different velocity field heterogenties. The mixing rule has less impact on particle spreading with a flux weighted initial condition. The transverse direction z is normalized by half the length the of domain z^* .

Figure 5 shows the same plots as in Fig. 4 for a flux weighted injection. Only the $\sigma_b^2 = 0.5$ so is provided as all σ_b^2 values displayed nearly identical behavior. The ratio of streamline routing to complete mixing for $f_{x_i}(z)$ is close to 1 throughout much of the domain, indicating nearly identical distribution of the solute plume for the two mixing rules. One exception is the area of yellow in the bottom right corner of the ratio figure (c), where streamline routing has a higher particle concentration. This is an area of low particle concentrations and is therefore more sensitive. The results presented here indicate that the mixing rule's impact on the evolution of $f_{x_i}(z)$ is less significant when particles are injected using a flux weighted initial condition.

To demonstrate these differences, Figure 6 shows particles within one realization of the lattice network with $\sigma_{ln(b)}^2 = 1.0$ where fractures are colored by pressure. The left sub-figure (a) is a snapshot of particles injected from a point injection where the complete mixing rule are splied and in the middle sub-figure (b) streamline routing is applied. As discussed above, the application of the complete mixing rule leads to higher transverse dispersion when com-



FIG. 6. Particles within the quasi-two-dimensional lattice network. In the left (a) and middle (b) sub-figures particles injected from the same point source on the left boundary and driven right by a pressure gradient. In sub-figure (a), particles adhere to a complete mixing rule (red) and in sub-figure (b) they follow streamline routing (blue). The choice of a complete mixing rule in combination with a point injection leads to higher transverse dispersion than if streamline routing is used under the same initial conditions. Sub-figure (c) shows particles injected using flux-weighting adhering to both mixing rules (red-complete mixing / blue-streamline routing). Here, no significant difference between the distribution of particle locations between the two rules is observed.

373 pared to streamline routing. The right sub-figure (c) shows both particles (red-complete 374 mixing / blue-streamline routing) injected using flux-weighting. Here, no significant differ-375 ence between the distribution of particle locations between the two rules is observed.

Figure 7 shows the mean value of the mean squared displacement (MSD) for point (a) arr and flux-weighted (b) initial conditions. These are calculated at each control plane by are averaging over all particles and all 25 realizations. Solid lines indicate streamline routing and are stars indicate complete mixing. Colors correspond to different aperture variances; $\sigma_{ln(b)}^2 =$ and 0.1, 0.5, 1 are depicted with blue, red, and green, respectively.

For the point injection, there is a significant difference between the observed MSD values for complete mixing and streamline routing. For all values of $\sigma_{ln(b)}^2$ complete mixing results in an increased MSD. The impact of the mixing rule on MSD decreases with increasing velocity field heterogeneity, shown by a decreasing difference in MSD between mixing rules. For the flux weighted injection the mixing rule's impact on MSD is less than in the point injection case, as the complete mixing and streamline routing curves more closely match. Note that the MSD is driven by displacements in the z direction due to the quasi-2D nature of the lattice.

³⁸⁹ In the point injection, the number of times particles change fractures averaged over all



FIG. 7. The mean MSD in the lattice network is calculated at each control plane by averaging over all particles and all 25 realizations. Solid lines indicate streamline routing and stars indicate complete mixing. Plotted is MSD for both the point (a) and flux weighted (b) initial conditions. Colors correspond to different aperture variances; $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$ are depicted with blue (upper curve in b), red, and green (lower curve in b), respectively. As velocity field heterogenity increases the mixing rule's impact on MSD decreases. A flux weighted injection results in less spatial variability of MSD.

³⁹⁰ particles and over 25 realizations increases for streamline routing by 52, 36 and 33% for ³⁹¹ $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$, respectively. As the velocity field heterogeneity increases, particles change ³⁹² fractures less frequently due to increased channelization to high discharge pathways. In the ³⁹³ case of flux-weighted injection, streamline routing increases the mean number of times a ³⁹⁴ particle changes fractures by 52, 39, and 36% for $\sigma_{ln(b)}^2 = 0.1, 0.5, 1$ compared with complete ³⁹⁵ mixing. Again as the velocity field heterogenity increases particles change fractures less ³⁹⁶ often and more particles are channelized to high discharge fractures.

³⁹⁷ C. Power Law Networks Simulations

398 1. Breakthrough Curves: TPL Network

The median breakthrough curves through the ten truncated power law (TPL) realizations for complete mixing (green stars) and streamline routing (thick orange lines) are shown in Figure 8. Solid lines correspond to point injections and dashed lines correspond to a flux



FIG. 8. Median breakthrough curves of 10 TPL realizations for complete mixing (green stars) and streamline routing (thick orange lines). Solid lines correspond to point injections and dashed lines correspond to a flux weighted initial condition. Each breakthrough curve realization is plotted with a transparent line. The mixing rule has a negligible impact of the distribution of arrival times. A flux weighted initial conditions homogenizes the spread of breakthrough curves.

⁴⁰² weighted initial condition. Each breakthrough curve realization is plotted with a transparent ⁴⁰³ line. No significant difference in the breakthrough curves is observed between the two mixing 404 rules indicating that the choice of mixing rule has a negligible impact of the distribution of arrival times. The breakthrough curve is changed in two ways when using the flux weighted 405 406 injection. First, breakthrough curves are shifted left, meaning particles on average traverse 407 the entire network in less time compared with a point injection. This indicates that on average, the selected flow paths resulting from the sampled point injection in this study are 408 slower than the fluxed weighted velocity average. However, given a larger sample of networks, 409 we expect median breakthrough curves to converge. Second, the variability in breakthrough 410 arrival times decreases with the flux weighted injection; the flux weighted breakthrough 411 curves are more clustered near the median, whereas the point injection breakthrough curves 412 ⁴¹³ display greater variation in arrival time for an associated cumulative concentration value.

414 2. Solute Spreading: TPL Network

Figure 9 shows the transverse breakthrough position distributions in z for one realization 416 of a truncated power law distributed radii network for the point (a) and flux weighted (b)



FIG. 9. The transverse breakthrough z-position distribution for one realization of a TPL network for a point (left column) and flux weighted (right column) initial injection mode. Simulations are completed for complete mixing (row 1: a,d) and streamline routing (row 2: b,e) intersection rules. Row 3 gives the ratio of streamline routing to complete mixing transverse breakthrough position concentrations. Colorbars show log probabilities (row 1,2: a,b,d,e) and the absolute ratio value (row 3: c,f). Streamline routing increases channelization of particles to secondary fractures, shown as areas of yellow in the ratio figures. The transverse direction z is normalized by half the length the of domain z^* .

⁴¹⁷ injection modes. The percent of particles on primary fractures remains similar across mixing $_{418}$ rules and over 50% of particles at a given control plane are concentrated on less than 10% of ⁴¹⁹ the total fractures in the system. In the case of point injection, there are primary fractures $_{420}$ as indicated by the brightly colored areas lying between 0 and 0.5 in z/z*. Between 0 and 2 $_{421} x/l^*$ there is a relatively low number of fracture intersections and particles trajectories are ⁴²² similar. In this region the ratio of streamline routing to complete mixing TBPD is O(1). At a $_{423}$ distance greater than 2 in x, the fracture intersection density increases and complete mixing more evenly distributes particles across secondary fractures, observed as a more uniform 424 color in TBPD distributions. In streamline routing, increased channelization to secondary 425 ⁴²⁶ fractures is observed as an increased number of streaks in the TBPD, particularly prevalent ⁴²⁷ in the top and bottom right corners of the TBPD figures. These streaks also appear as ⁴²⁸ yellow areas in the bottom figure that shows the ratio of the concentration for the two rules. With a flux weighted initial condition, the mixing rule again causes significant differ-429 ences in TPBD on secondary fractures, observed as an increased number of streaks in the 430 streamline routing simulations. However, the general evolution of particle spreading remains 431 ⁴³² similar. Areas of high particle concentration (green and yellow colors) are similar for each $_{433}$ mixing rule. There is a primary fracture (brightly colored) that extends from 1 to 2 in x $_{434}$ and 0 to 0.5 in z that has a streamline routing TBPD to complete mixing TBPD of O(1), ⁴³⁵ indicating particle concentration on this fracture is approximately equal.

Figure 10 shows the MSD, averaged over all particles in the 10 realizations of TPL are networks, for complete mixing (green) and streamline routing (orange) with a point (solid and flux weighted (dashed lines) injection. There is less spatial variability in MSD for the flux weighted injection condition. As opposed to the lattice, the complicated network structure constrains the spreading of particles thereby limiting the impact of the mixing trule on MSD. The observed channelization due to streamline routing has a small impact on average particle behavior. The mean (averaged over all particles and all realizations) and number of times a particle changes fractures from inlet to outlet increases approximately from 7.7 in complete mixing to 8.0 in streamline routing. This change percentage is less than in the lattice because the fracture intersection density is lower in the TPL networks. Consistent with the point injection on the lattice, MSD increases with increasing distance the fracture intersection density is lower in the TPL networks.

⁴⁴⁸ In the case of the flux-weighted injection, the mean number of times particles change



FIG. 10. The MSD is averaged over all particles in 10 realizations of stochastically generated TPL networks for complete mixing (green) and streamline routing (orange) with a point (solid lines) and flux weighted (dashed lines) injection. The MSD for the flux weighted injections has less spatial variability. The network structure drives particle spreading and so the impact of the mixing rule on MSD is negligible.

⁴⁴⁹ fractures increases 5% from 6.2 for complete mixing to 6.5 for streamline routing. The flux
⁴⁵⁰ weighted initial condition increases the initial spread of particles compared to the point in⁴⁵¹ jection, which allows transverse breakthrough to occur across a larger portion of the domain.
⁴⁵² Hence, the flux weighted injection increases MSD at all measured control planes. As was
⁴⁵³ the case for the point injection, the MSD values are nearly the same for both mixing rules.
⁴⁵⁴ Similar to the lattice flux weighted injection simulations, MSD remains relatively constant as
⁴⁵⁵ distance from the inlet increases, with spatial changes resulting from the network structure
⁴⁵⁶ and not the mixing rule.

457 V. DISCUSSION

The results of the simulations presented in the previous section indicate that there are scenarios where the choice of mixing rule at fracture intersections can have a large impact behavior and other scenarios where the impact is negligible. As noted in the introduction, this is consistent with the literature where seemingly opposite statements are ⁴⁶² made with regard to how important is the mixing rule. The magnitude of the mixing rule's ⁴⁶³ influence is determined by how particles enter the network, the complexity of the fracture ⁴⁶⁴ network, and the heterogenity of the velocity field.

465 A. Injection Mode

There are two major differences between the flux weighted and point injection modes 466 467 that cause differences in solute spreading. First, a point injection releases particles onto one 468 fracture and all particles are influenced by the same local effects near the injection point. Therefore, the initial behavior is highly dependent on where the particles are released. The 469 flux weighted initial condition spreads particles across the entire inlet, thereby reducing the 470 impact of such local effects and reflecting a more broad statistical sampling of the hetero-471 geneous system. Second, a flux weighted injection channelizes particles to high discharge 472 fractures from the start of the simulation. The flux weighted injection weights high dis-473 charge fractures more than low discharge fractures by distributing particles proportionally 474 to fracture discharge, meaning particles channelize on primary fractures immediately. As 475 a fracture's discharge increases the probability of a particle leaving that fracture decreases. 476 Thus the mixing rule's impact decreases as more particles are distributed to high discharge 477 fractures because particles preferentially remain on these high discharge pathways. This 478 decreased impact is demonstrated by similar TPBD evolution for each mixing rule when 479 particles are flux weighted injected. 480

In a large enough network, the initial distribution of Lagrangian velocities evolves to an 481 asymptotic stationary distribution, where Langrangian velocities becomes proportional to 482 the local velocity field, i.e. the transverse concentration distribution for the point injection 483 will converge to the flux weighted injection concentration distribution. The time needed to 484 for this to occur can be characterized with a Taylor-like timescale, $T_T = \frac{a^2}{D_T}$, where a is a 485 characteristic length and D_T is effective dispersion. In both network structures we observe 486 that the point injected MSD approaches the flux weighted MSD as distance (and time) from 487 particle release increase. Note that a and D_T are strongly affected by the network geometry 488 489 and so T_T changes with varying network structures. Additionally, the mixing rule influences 490 D_T ; mainly complete mixing increases D_T , and thus T_T decreases.

⁴⁹¹ In a regularized geometry, such as the lattice, we observed complete mixing enhances

⁴⁹² initial particle spreading for a point injection (Figure 4). At the length scales considered, ⁴⁹³ the point injection breaks Lagrangian ergodicity, that is the Lagrangian velocity statistics ⁴⁹⁴ sampled along a particle trajectory is not equivalent to an ensemble average across all ⁴⁹⁵ particle velocities. Dentz et al. [52] showed that in steady heterogenous flows, a Langrangian distribution found by spatially sampling along particle trajectories is stationary if the initial 496 particle velocity distribution is equivalent to the Eulerian flux weighted velocity distribution. 497 Once sufficient time has passed and the initial condition is erased, ergodicity is established 498 and the mixing rule becomes negligible for transverse particle spreading (Figure 5). Since 499 ergodicity is not established at pre-asymptotic times for a point injection, the mixing rule 500 does impact spreading on the lattice. However, in networks with highly heterogeneous 501 structures, network geometry becomes increasingly important and the impact of the injection 502 ⁵⁰³ mode decreases. For example, in the TPL networks there is a relatively small number of ⁵⁰⁴ fracture intersections and so particle transport is constrained by the network geometry and the injection mode and mixing rule has negligible impact even at pre-asymptotic times 505 (Figure 9). 506

507 B. Network Structure

A fracture network's geometry, specifically the fracture intersection density and fracture 508 ⁵⁰⁹ orientation, constrains plume spreading. As the fracture intersection density increases, par-⁵¹⁰ ticles have an increased probability of changing fractures. The lattice network has a higher density of fracture intersections than the TPL networks and all intersections are continuous 511 junctions, i.e. incoming inlets are adjacent. Therefore the mixing rule more significantly 512 impacts particle spreading behavior. In continuous junctions, streamline routing increases 513 the probability of changing fractures (to the adjacent) by a factor of $\frac{q_{adj}+q_{opp}}{q_{adj}}$ or $\frac{q_{adj}+q_{opp}}{q_{in}}$ 514 when $q_{in} < q_{adj}$ and $q_{in} > q_{adj}$, respectively. In the lattice network, particles regularly visit 515 fracture intersections and streamline routing probabilisticly directs more particles to adja-516 cent fractures, causing particle pathlines to more frequently alternate between positive and 517 negative directions. This alternating pattern of positives and negatives cancel, focusing the 518 ⁵¹⁹ particle concentration near the initial inlet transverse position (Figure 4). Hence, particle ⁵²⁰ pathlines are significantly altered by the intersection mixing rule, especially when outlet ⁵²¹ discharges are similar in magnitude.

The 3D geometry and reduced connectivity of the TPL networks results in transport that 522 ⁵²³ is constrained by geometrical and topological network properties. In turn, these features, which are far more complex than the quasi-2D lattice, decreases the impact of the mixing 524 rule relative to the lattice. One such geometrical effect, local flow cells, develop from vari-525 ations in fracture radii length and orientation, which manifests as elongated tails in solute 526 breakthrough [53]. Additionally, particles remain on fractures for longer distances because 527 they encounter fewer intersections, i.e., solute spreading is structurally constrained. More-528 over, fracture aperture is positively correlated to the fracture radius in the TPL networks. 529 By nature of the truncated power law distributions a small percentage of fractures will 530 therefore have substantially larger permeability and dominate transport due to geometric, 531 topological, and hydrological preference. In combination, these attributes dominant local 532 ⁵³³ flow behavior and decreases the impact of the mixing rule.

Furthermore, streamline routing increases the probability of transferring particles to the adjacent fracture in a continuous intersection by a factor of $\frac{q_{adj}+q_{opp}}{q_{in}}$ for $q_{in} > q_{adj}$, which is typical in the case of a particle traveling on a preferential flow path. For a particle traveling on such a pathway (which is the majority) in the TPL network, $q_{in} \approx q_{out}$ as they lie on the same fracture; $q_{in} >> q_{adj}$ is expected due to the fracture length distribution. This suggests that the probability of a particle changing fractures remains nearly identical ($\frac{q_{adj}+q_{opp}}{q_{in}} \approx 1$) between streamline routing and complete mixing, and the choice of mixing rule is negligible in networks with strong preferential flow pathways, such as the TPL networks considered in this study.

543 C. Velocity Field Heterogeneity

⁵⁴⁴ Closely coupled with the network structure is the velocity field heterogeneity. In fact, ⁵⁴⁵ Margolin et al. [54] found that increasing the network sparseness has the same effect as ⁵⁴⁶ increasing the velocity field heterogeneity. As the difference between incoming discharge ⁵⁴⁷ magnitudes increases, the probability of being routed to the higher magnitude outlet also ⁵⁴⁸ increases and the impact of the mixing rule decreases. On the lattice, velocity field hetero-⁵⁴⁹ geneity increases as the variance of the fracture aperture distribution increases. Increasing ⁵⁵⁰ velocity heterogeneity leads to the development of preferential flow paths in large aperture ⁵⁵¹ regions [55], which cause greater channelization of particles and form a subnetwork of frac⁵⁵² tures that dominate transport. The mean number of times a particle changes fractures ⁵⁵³ decreases with increasing velocity heterogeneity because the probability of transferring from ⁵⁵⁴ primary fractures decreases. Additionally, the difference in the number of fracture changes ⁵⁵⁵ between mixing rules also decreases as the velocity field heterogeneity increases. Hence, par-⁵⁵⁶ ticle pathlines become more similar and the mixing rule's impact decreases as the velocity ⁵⁵⁷ heterogeneity increases, which is consistent with the conclusions of Kang et al. [10].

In the TPL networks, discharge through a fracture is directly related to the fracture radii, 558 ⁵⁵⁹ hence the distribution of fracture sizes naturally forms a highly heterogeneous velocity field. The evolution of transverse spreading for both mixing rules looks very similar through TPL 560 networks because the large radii fractures channelize particles and the network geometry 561 drives overall spreading trends. In addition to the velocity field heterogeneity, other factors 562 control transport and reduce the impact of the mixing rule, e.g. network connectivity and 563 geometry [56]. In the context of conservative transport, the higher heterogeneity of the 564 TPL network makes the impact of the mixing rule negligible on spreading metrics, a finding 565 consistent with Park et. al. [19] who studied conservative transport through 2D DFNs with 566 567 power law radii distributions.

568 D. Implications for Reactive Transport

The results of this study suggest that the mixing rule has an small impact on common 569 conservative transport metrics, i.e. breakthrough curves; mean square displacement; and the 570 general distribution of TBPD, in complicated geologic media where the network structure 571 and velocity field are often highly heterogeneous. While these metrics quantify transport 572 behavior at the network scale there are smaller-scale physical and chemical variations in 573 geologic media that are important in the context of reactive transport [57]. In this study we 574 observe that the mixing rule significantly impacts channelization of particles at the fracture 575 scale. Such channelization is important because it drives solute together, enhancing the 576 mixing rate and increasing the probability that two species react [24]. Zho et al. [18] showed 577 that the fracture surface roughness increases particle channelization through an intersection, 578 ⁵⁷⁹ thereby increasing solute mixing at the fracture intersection scale. Similarly, we investigate ⁵⁸⁰ how channelization due to the intersection mixing rule influence solute mixing, and thus ⁵⁸¹ reactions, at the fracture scale.

Consider a system with two reactive species A and B, who undergo the irreversible 582 ⁵⁸³ chemical reaction $A + B \rightarrow C$, such as precipitation of a mineral and two ions [58–61]. The nature of such reaction requires the difference in concentrations of species to be conserved. 584 Denote u as the conserved quantity, where $u = c_A - c_B$ and c_i is the concentration of species 585 i [58]. Consequently, the amount of C that can be precipitated is dependent on the less 586 abundant species between A and B. In geochemical systems described by instantaneous 587 equilibrium reactions, De Simoni et al. [58] showed the reaction rate between A and B588 is a product of a flow driven mixing term $\nabla^T u \nabla u$ and a stochiometric term. Hence, the 589 mixing rate is directly related to the rate of reaction. The mixing rate is independent of 590 the chemical effects. Since u and particles in DFNWORKS are both conserved quantities 591 $_{592}$ and have the same governing equations, we can measure u and therefore the mixing rate. 593 Similar to the TBPD measured in Figure 9, we also measure the joint y - z breakthrough ⁵⁹⁴ position distribution at each control plane, i.e. we discretize each control plane into a 2D grid and measure breakthrough concentration in each cell. This enables construction of 595 the 3D position breakthrough field. The position breakthrough field provides the entire 596 u-concentration field that arises after large time in a steady flow, in which u particles are 597 continuously injected. The mixing rate is calculated from this u-concentration field. 598

The ratio of computed mixing rates using streamline routing and complete mixing is plotted throughout the three dimensional domain (Figure 11) for one network realization with a point injection (a) and flux weighted injection (b). The injection plane is on the front from the front from the primary flow direction is directed to the back left face in both sub figures. The ratio of mixing rates at areas near the inlet where particles have yet to encounter a fraction intersection is 1. After particles pass through fracture intersections, the mixing rule distributes particles differently causing significant local effects in the mixing rates, e.g. notice the yellow colored streak intersecting the outlet plane where the local mixing rate of differs by two orders of magnitudes.

Figure 12 shows the mean normalized mixing rate at each control plane averaged over all realizations for a point injection (a) and flux weighted injection (b) in the TPL networks. For each realization, the mixing rate is normalized by the maximum mixing rate observed in the streamline routing case. On average, streamline routing elevates the mean mixing rate for both modes of injection. The mixing rate is similar across mixing rules when $x^*/l < 1$, which corresponds to a distance equal to the radii of the largest fracture in the network.



FIG. 11. The ratio streamline routing to complete mixing local mixing ratios is shown for one TPL network realization for a point (a) and flux weighted (b) initial injection. The front right face is the plane of injection and the back left face is the domain outlet. Color bars plot the absolute ratio value. Near the inlet plane, the ratio between mixing rules is 1 because transport has yet to encounter fracture intersections. Near the outlet plane, we observe streaks where local mixing rates differ by a factor of 100. Differences in mixing rate occur from differences in channelization of particles due to the mixing rule.

⁶¹⁴ After traveling this distance, the mixing rate is noticeably greater when streamline routing ⁶¹⁵ is used in the domain.

The transverse breakthrough position distributions in the TPL networks display increased 616 channelization of particles on secondary fractures for a streamline routing mixing rule, cf. 617 ⁶¹⁸ Fig. 9. These regions of increased channelization are therefore also areas of increased mixing. Hence, it is expected that streamline routing increases the average mixing rate at each 619 control plane. Figure 12 shows that streamline routing increases the mean mixing rate at 620 a distance of approximately equal to the length of the largest fracture radii in the system 621 l^* . Near the particle source, the mixing rule has a smaller impact on channelization because 622 ₆₂₃ particles have encountered less fracture intersections. At distances exceeding l^* a particle 624 must have encountered at least one fracture intersection and so the mixing rule becomes more ₆₂₅ important, as fracture intersections enable particles to be channelized to other fractures.

At the fracture scale the local mixing rate can differ by a factor of 100 or greater between



FIG. 12. The mean mixing rate averaged over 10 TPL realizations at each control plane is compared for complete mixing (green) and streamline routing (orange) with a point injection (a) and flux weighted (b) initial injection. In each realization, the mixing rate is normalized by maximum mixing rate observed for streamline routing. Streamline routing increases the mean mixing rate. At distances greater than l^* from the particle source the difference between mixing rules is greater because particles have encountered at least one fracture intersection.

the different mixing rules. Such large variation occurs on smaller fractures, which are more sensitive to the mixing rule. Large fractures are less sensitive to the mixing rule because they carry more particles and the probability of switching from them is lower, meaning the concentration gradient is more stable. In systems where solute and the rock boundary react to dissolve and precipitate minerals, a large difference in mixing rate may lead to significant differences in the temporal evolution of transport. Hence implementing the most physically appropriate mixing rule is necessary for developing reliable predictive DFN modeling of reactive transport.

⁶³⁵ Cvetkovic et al. [5] simulated sorbing tracers through a 3D DFN. Reactive transport ⁶³⁶ was quantified with a hydrodynamic retention variable β , which is a normalized surface ⁶³⁷ area for diffusion transfer into the rock boundary [62]. They found that streamline routing ⁶³⁸ has a small impact on β compared with complete mixing, but streamline routing does ⁶³⁹ slightly shift β towards higher values. The increased β suggests streamline routing is more ⁶⁴⁰ reactive. These results are consistent with our observations of increased channelization ⁶⁴¹ to secondary fractures under streamline routing, as β increases as aperture size decreases ⁶⁴² and secondary fractures typically have smaller apertures than primary fractures. β is an ⁶⁴³ averaged parameter over particle trajectories and so the significant local effects observed ⁶⁴⁴ in this studied are not apparent by a slightly increased value. The results of our study ⁶⁴⁵ suggest that the slight increase in β observed by Cvetkovic et. al [62]. could be the result ⁶⁴⁶ of increased channelization of particles to secondary fractures with streamline routing.

647 VI. REMARKS

We presented a study characterizing the impact of particle behavior at fracture intersec-648 ⁶⁴⁹ tions in three-dimensional DFNs on upscaled transport behavior. Mass transfer at fracture 650 intersections in DFN models is represented with two subgrid processes, complete mixing 651 and streamline routing, which are the end member cases of the Péclet number, i.e. particle ⁶⁵² motion through a fracture intersection is governed only by diffusion or advection, respec-⁶⁵³ tively. The simulations presented in the previous section indicate that there are scenarios where the choice of mixing rule at fracture intersections have a large impact on transport 654 behavior and other scenarios where the impact is negligible. The magnitude of impact of 655 the mixing rule is determined by the particle initial injection mode, the fracture network 656 657 structure, and the heterogenity of the velocity field. The mixing rule's impact increases with a point injection because local effects associated with the fracture of injection control 658 ⁶⁵⁹ initial particle transport. As the network geometry and velocity field heterogeneity increase, ₆₆₀ particle channelization to high discharge fractures increase and the impact of the mixing rule on conservative transport at the network scale decreases. In all cases, however, streamline ₆₆₂ routing increases channelization of mass to secondary fractures, resulting in an increased average mixing rate and local mixing rates that can differ by two orders of magnitude. Therefore, the choice of mixing rule at fracture intersections will influence reactive trans-664 665 port simulations within DFN models. We consider the two end members for intersection ⁶⁶⁶ mixing rules and our simulations enforce that every intersection prescribes to the same rule. 667 In real geologic media, both advection and diffusion affect mass transfer and a distribution 668 of local fracture intersection Pe exists. Quantifying the impact of these processes warrants 669 future investigation.

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