Development of a new semi-analytical model for cross-borehole flow experiments in fractured media

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Abstract

Analysis of borehole flow logs is a valuable technique for identifying the presence of fractures in the subsurface and estimating properties such as fracture connectivity, transmissivity and storativity. However, such estimation requires the development of analytical and/or numerical modeling tools that are well adapted to the complexity of the problem. In this paper, we present a new semi-analytical formulation for cross-borehole flow in fractured media that links transient vertical-flow velocities measured in one or a series of observation wells during hydraulic forcing to the transmissivity and storativity of the fractures intersected by these wells. In comparison with existing models, our approach presents major improvements in terms of computational expense and potential adaptation to a variety of fracture and experimental configurations. After derivation of the formulation, we demonstrate its application in the context of sensitivity analysis for a relatively simple two-fracture synthetic problem, as well as for field-data analysis to investigate fracture connectivity and estimate fracture hydraulic properties. These applications provide important insights regarding (i) the strong

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sensitivity of fracture property estimates to the overall connectivity of the system; and (ii) the non-uniqueness of the corresponding inverse problem for realistic fracture configurations.

Keywords: Fractures and faults, Groundwater, Cross-borehole flow experiment, Semi-analytical model

1 1. Introduction

The study of fractured rocks is highly important in a wide variety of re-2 search fields and applications including hydrogeology, geothermal energy, 3 hydrocarbon extraction, and the long-term storage of toxic waste (*Carneiro*, 2009; Dershowitz and Miller, 1995; Gautam and Mohanty, 2004; Kolditz and 5 Clauser, 1998; Rotter et al., 2008). As fractures represent either rapid ac-6 cess to some resource of interest or potential pathways for the migration of 7 contaminants in the subsurface, identifying their presence and determining 8 their properties are critical, albeit highly challenging, tasks. In order to 9 tackle these challenges, numerous fracture characterization methods have 10 been developed; borehole geophysical logging (e.g., (Hearst et al., 2000; 11 Keys and MacCary, 1971), dilution tests (e.g., (Paillet, 2012)), single and 12 cross-borehole flow experiments (e.g., (Day-Lewis et al., 2011; Le Borgne 13 et al., 2006; Paillet et al., 2012)), as well as temperature measurements 14 (e.g., (Klepikova et al., 2014; Leaf et al., 2012; Pehme et al., 2013)) have 15 all been used in an effort to gain both qualitative and quantitative informa-16 tion regarding the properties of individual fractures and fracture networks. 17 Amongst these methods, cross-borehole flow analysis aims to evaluate frac-18 ture connections and hydraulic properties from vertical-flow-velocity mea-19 surements conducted in one or more observation boreholes under forced 20 hydraulic conditions. Previous studies have demonstrated that analysis of 21

these data, especially when acquired in a transient manner, can provide 22 important information on fracture connectivity, transmissivity, and stora-23 tivity, with significantly less effort and expense than conventional packer 24 tests (Le Borgne et al., 2006; Paillet, 1998; Paillet et al., 2012; Williams 25 and Paillet, 2002). As such, cross-borehole flow data can yield, at the very 26 least, key preliminary information on highly conductive fractures and/or 27 fracture zones that may be subsequently targeted for more detailed and 28 costly investigations. 29

Because of the strong non-linearity and non-uniqueness of the problem, 30 relating vertical-flow velocities measured in a borehole to fracture hydraulic 31 characteristics is by no means straightforward and generally requires the 32 use of adapted mathematical models. To this end, analytically-based (Day-33 Lewis et al., 2011; Paillet, 1998) and numerical (Klepikova et al., 2013) for-34 ward modeling approaches have been utilized for the interpretation of single 35 and cross-borehole flow data. The strong advantage of analytically-based 36 formulations is their low computational cost, which means that they can be 37 effectively used within stochastic inverse approaches, as well as for parameter 38 and predictive uncertainty quantification and detailed sensitivity analysis. 30 Indeed, numerical solutions such as those involving finite elements, albeit 40 highly flexible, are not generally suitable in the context of the hundreds to 41 thousands of forward solutions necessary to address the latter goals. 42

Existing analytically-based solutions for flow experiments in fractured media are either limited to single-borehole tests (*Day-Lewis et al.*, 2011) or based on a semi-quantitative approach involving a relative description of the hydraulic properties that assumes the same storativity for all the fractures (*Le Borgne et al.*, 2006; *Paillet et al.*, 2012; *Williams and Paillet*, 2002). Although the latter approach, which is designed for cross-borehole studies, ⁴⁹ allows for individual fractures to intersect either the observation borehole,
⁵⁰ the pumped borehole, or both, its flexibility is limited in terms of the num⁵¹ ber of boreholes considered and the interactions between the fractures. In
⁵² particular, the formulation as presented is limited to a single observation
⁵³ borehole, and its extension to more complex experimental configurations, if
⁵⁴ feasible, does not seem straightforward.

With the aim of addressing the above limitations, we present in this 55 paper a new semi-analytical model for cross-borehole flow experiments in 56 fractured media. Treating each fracture as a locally-leaky confined aquifer, 57 borehole vertical-flow velocities are calculated by coupling the continuity 58 equations for flow in the aquifers with a set of equations governing flow in the 59 boreholes. Our model is presented in a general manner, with all assumptions 60 fully noted, and it offers the flexibility of modeling a variety of fracture and 61 experimental conditions, for example the presence of multiple observation 62 boreholes and multiple connection configurations. We begin below with a 63 full derivation and description of the developed semi-analytical modeling 64 approach. Next, the approach is demonstrated in the context of sensitivity 65 analysis for a simple two-fracture synthetic problem involving two boreholes 66 and two different connection configurations. Finally, we present the results 67 of estimating fracture connectivity, transmissivity, and storativity from field 68 data collected and previously analyzed by Paillet et al. (2012) using their 69 developed semi-quantitative approach. 70

71 2. Model development

72 2.1. Overall approach

We consider in this paper a general cross-borehole flow experiment whereby 73 hydraulic forcing (i.e., pumping or injection) is conducted in one borehole 74 and transient vertical-flow-velocity measurements are acquired at different 75 depths in one or more observation boreholes, the latter of which are usually 76 different from the pumped borehole. Measurements of the flow velocity are 77 considered to be available between each fracture intersecting the observation 78 borehole(s), as well as between the most shallow fracture(s) and the surface. 79 Depending on the connectivity of the system, the fractures in the observa-80 tion borehole(s) may or may not intersect the pumped/injection borehole. 81 As an example, Figure 1a shows a schematic representation of a fractured 82 environment where the fracture located at position z = 26 m in the observa-83 tion borehole intersects only this borehole. The fracture located at position 84 z = 52 m, on the other hand, intersects both the observation and pumped 85 boreholes. 86

To model the general configuration described above, we represent the 87 fractures as a series of equivalent confined aquifers that are hydraulically 88 connected through the boreholes (e.g., *Paillet*, 1998; *Paillet et al.*, 2012; 89 Williams and Paillet, 2002). Figure 1b shows the equivalent representation 90 of the system in Figure 1a involving five confined aquifers and two bore-91 holes. The vertical-flow velocities occurring in each borehole under forced 92 hydraulic conditions are denoted by q_I^i , where *i* is the borehole number and 93 I is the aquifer number above which the vertical flow occurs. The hydraulic 94 properties of aquifer I are its transmissivity T_I and storativity S_I . Note 95 that lower- and upper-case indices are used below to indicate borehole and 96

97 aquifer numbering, respectively.

Development of our model for cross-borehole flow involves coupling of the 98 continuity equations for flow in the confined aquifers with equations govern-99 ing the vertical flows between the aquifers through the boreholes. The latter 100 flows are taken into account as localized source/sink terms and their average 101 velocities are related to hydraulic head differences in the boreholes through 102 the Hagen-Poiseuille law. It should be noted that similar coupling methods 103 have been used for the evaluation of fluid leakage through abandoned wells 104 in multilayered-aquifer systems (Avci, 1994; Cihan et al., 2011; Nordbotten 105 et al., 2004). In these studies, the final solution is expressed in terms of 106 the hydraulic head and formulated in either the time or Laplace domains, 107 and both the pumping and observation boreholes are assumed to intersect 108 the series of parallel aquifers. In comparison, our formulation is especially 109 developed for cross-borehole experiments in fractured media in that: (i) it 110 allows for situations where a fracture intersects only some of the boreholes; 111 (ii) the final solution is expressed directly in terms of the relative borehole 112 vertical-flow velocities and solved in the time domain. 113

In the following, we first develop an analytical expression for the hy-114 draulic head in a single confined aquifer subject to one or more localized 115 leakages (Section 2.2). This leads us to develop an expression for the bore-116 hole vertical-flow velocities for a system of confined aquifers where the local-117 ized leakages correspond to the borehole connections (Section 2.3). Lastly, 118 details are provided on the semi-analytical implementation of the latter ex-119 pression in order to determine vertical-flow velocities from a given set of 120 aquifer properties and connections. This is done through the solution of a 121 linear system (Appendix). 122



Figure 1: (a) Schematic illustration of the fractured geological formation considered in *Paillet et al.* (2012); (b) Equivalent representation as a series of confined aquifers connected through the boreholes. Vertical-flow velocities measured above aquifer I in borehole i are denoted by q_I^i , whereas aquifer transmissivities and storativities are denoted by T_I and S_I , respectively.

123 2.2. Hydraulic head in a single, locally-leaky, confined aquifer

124 2.2.1. Mathematical formulation

¹²⁵ Consider a homogeneous, isotropic, confined aquifer where flow can be rep-¹²⁶ resented as two-dimensional in the x - y plane. The hydraulic head distri-¹²⁷ bution averaged over the aquifer thickness, h(x, y, t) [m] at position (x, y)¹²⁸ and time t, is governed by the following continuity equation for flow in a ¹²⁹ confined aquifer (e.g., *Bear*, 1979):

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$$S\frac{\partial h}{\partial t} - T\left(\frac{\partial^2 h}{\partial x^2} + \frac{\partial^2 h}{\partial y^2}\right) = q,$$
(1)

where $T \text{ [m}^2/\text{s]}$ and S [-] are the aquifer transmissivity and storativity, respectively, and q(x, y, t) [m/s] represents the spatial and temporal distribution of sources (q > 0) and sinks (q < 0), which are defined as flows per unit area per unit time. Let us also consider that the time dependence of the hydraulic head is caused by a pumping or injection experiment that begins at time t = 0 in a domain where the initial hydraulic head distribution $h_0(x, y)$ is governed by the steady-state equation

$$-T\left(\frac{\partial^2 h_0}{\partial x^2} + \frac{\partial^2 h_0}{\partial y^2}\right) = q_0, \qquad (2)$$

where $q_0(x, y)$ is the spatial distribution of sources and sinks existing before the beginning of the experiment (i.e., for t < 0). Note that this implies a boundary condition of $h(x, y, t) = h_0(x, y)$ at infinite positions, where no effect of the pumping/injection experiment is to be expected.

Considering equations (1) and (2), the relative hydraulic head or drawdown in the aquifer $H(x, y, t) = h(x, y, t) - h_0(x, y)$ is governed by the equation

$$\frac{\partial H}{\partial t} - \alpha \left(\frac{\partial^2 H}{\partial x^2} + \frac{\partial^2 H}{\partial y^2} \right) = \frac{Q}{S},\tag{3}$$

and subject to the initial condition H = 0 and boundary condition H = 0 at infinite positions. Here, $Q(x, y, t) = q(x, y, t) - q_0(x, y)$ represents a relative source/sink term and $\alpha = T/S$ is the hydraulic diffusivity. Note that the definition of Q in this manner is critical as interpretations of cross-borehole flow experiments are based on relative flow-velocity measurements.

The elementary solution (or Green's function) H^* corresponding to equation (3) can be obtained by replacing the right-hand side of the expression with the Dirac delta function $\delta(x-x', y-y', t-t')$ and considering the initial and boundary conditions. This yields

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$$H^*(x - x', y - y', t - t') = \frac{e^{-\frac{(x - x')^2 + (y - y')^2}{4\alpha(t - t')}}}{4\pi\alpha(t - t')}u(t - t'),$$
(4)

where $u(\cdot)$ is the Heaviside step function. $H^*(x - x', y - y', t - t')$ can be interpreted as the hydraulic head at position (x, y) and time t due to an instantaneous injection at position (x', y') and time t'. As is standard practice (e.g., *Carslaw and Jaeger* (1986)), this result can be multiplied with equation (3) and integrated over space and time to express the general solution to equation (3) as

$$H(x, y, t) = \frac{1}{S} \int_0^t \int_{-\infty}^{+\infty} \int_{-\infty}^{+\infty} Q(x', y', t') H^* dx' dy' dt',$$
(5)

¹⁶⁹ which can be rewritten as

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$$H(x, y, t) = \frac{1}{S} \int_{-\infty}^{+\infty} \int_{-\infty}^{+\infty} Q *_t H^* dx' dy',$$
(6)

¹⁷² where the convolution product in time is defined as

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$$f *_t g = \int_0^t f(t')g(t-t')dt'.$$
 (7)

Considering the relative source/sink term in equation (6) as being the result of localized leakages through boreholes intersecting the aquifer, Q(x, y, t)can be approximated as

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$$Q(x, y, t) = \begin{cases} Q^{i}(t), & \text{if } (x, y) \in C_{i}, \quad i = 1, ..., n \\ 0, & \text{if } (x, y) \notin C_{i}, \quad i = 1, ..., n, \end{cases}$$
(8)

where $Q^i(t)$ is the relative average flow velocity over the cross-sectional area C_i of borehole *i*, and *n* is the number of boreholes intersecting the aquifer. ¹⁸² Combining expressions (6) and (8) leads to the following expression for the ¹⁸³ transient hydraulic head distribution h(x, y, t):

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$$h(x, y, t) = h_0 + \sum_{i=1}^n Q^i *_t \mathcal{H}^i,$$
(9)

where $\mathcal{H}^i = \mathcal{H}^i(x, y, t - t')$ is defined as

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$$\mathcal{H}^{i}(x, y, t - t') = \frac{1}{S} \int_{C_{i}} H^{*} \left(x - x', y - y', t - t' \right) \mathrm{d}x' \mathrm{d}y'.$$
(10)

189 2.2.2. Relationship to existing analytical solutions

Consider a single borehole experiment (n = 1) where a constant flow rate of \mathcal{Q} [m³/s] is injected into $(\mathcal{Q} > 0)$ or extracted from $(\mathcal{Q} < 0)$ a single confined aquifer. The borehole has cross-sectional area C_1 , radius r_1 , and is located at position $(x_1, y_1) = (0, 0)$. The relative hydraulic head or drawdown in the aquifer can be expressed using equation (9) as

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¹⁹⁶
$$H(x,y,t) = \int_0^t Q^1(t') \mathcal{H}^1(x,y,t-t') \mathrm{d}t', \tag{11}$$

where $\mathcal{H}^1(x, y, t - t')$, defined in equation (10), can be approximated here as

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$$\mathcal{H}^{1}(x, y, t - t') = \frac{\pi r_{1}^{2}}{S} H^{*} \left(x - x_{1}, y - y_{1}, t - t' \right).$$
(12)

Assuming an absence of vertical flow in the borehole before the beginning of the experiment, the relative average flow velocity Q^1 is related to the constant flow rate Q through $Q^1 = Q/(\pi r_1^2)$, which leads to the expression

$$H(x, y, t) = \frac{\mathcal{Q}}{S} \int_0^t \frac{e^{-\frac{x^2 + y^2}{4\alpha(t - t')}}}{4\pi\alpha(t - t')} u(t - t') dt'.$$
(13)

²⁰⁵ The above equation can be rewritten as the well-known Theis solution

$$H(x, y, t) = \frac{Q}{4\pi T} \int_0^t \frac{e^{-\frac{r^2 S}{4T\tau}}}{\tau} u(\tau) d\tau, \qquad (14)$$

208 with $r = \sqrt{x^2 + y^2}$.

209 2.3. Accounting for borehole connections between aquifers

210 2.3.1. Hydraulic head in a connected aquifer

Consider now a scenario involving multiple aquifers where aquifer number I 211 is intersected by n_I boreholes. Each of these boreholes i $(i = 1, ..., n_I)$ passes 212 through a sequence of aquifers, which we denote by the ordered set A^i . As 213 an example, for the equivalent representation illustrated in Figure 1b, $A^1 =$ 214 $\{2,3,5\}$ and $A^2 = \{1,2,3,4,5\}$ for the pumped and observation boreholes, 215 respectively, as the pumped borehole intersects Aquifers 2, 3, and 5 and the 216 observation borehole intersects all of the aquifers in the system. Let us define 217 $A^{i}_{-}(I)$ and $A^{i}_{+}(I)$ as the aquifers that are located above and below aquifer 218 I in borehole i, respectively, and thus which correspond to the previous and 219 next aquifers with respect to I in the set A^i . The definition of $A^i_{-}(I)$ and 220 $A^i_+(I)$ clearly depends on the considered borehole as not all fractures will 221 intersect every well (e.g., in Figure 1b, $A_{-}^{1}(3) = 2$ and $A_{+}^{1}(3) = 5$ whereas 222 $A^2_{-}(3) = 2$ and $A^2_{+}(3) = 4$). Aquifers $I, A^i_{-}(I)$, and $A^i_{+}(I)$ are located at 223 depths $z_I^i, z_{A_{-}^i(I)}^i$, and $z_{A_{+}^i(I)}^i$, respectively (Figure 2). 224

Let $h_I(x, y, t)$ denote the transient hydraulic head distribution in aquifer I, which is governed by equation (1). As illustrated in Figure 2, the borehole connections between this aquifer and aquifers $A^i_{-}(I)$ and $A^i_{+}(I)$ imply sink and source terms at the borehole locations given by the vertical-flow velocities q^i_I and $q^i_{A^i_{+}(I)}$, respectively. Equation (9) thus leads to the following expression:

$$h_{I}(x, y, t) = h_{0,I} + \sum_{i=1}^{n_{I}} \left[Q_{A^{i}_{+}(I)}^{i} - Q_{I}^{i} \right] *_{t} \mathcal{H}_{I}^{i},$$
(15)

where $h_{0,I}$ is the initial hydraulic head distribution in the aquifer, and Q_I^i and $Q_{A^i_+(I)}^i$ are the relative flow velocities corresponding to q_I^i and $q_{A^i_+(I)}^i$, respectively. Note that \mathcal{H}_{I}^{i} in the above expression is defined by equations (10) and (4) with all hydraulic properties set equal to their values in aquifer I.



Figure 2: Schematic illustration of an aquifer I connected through borehole i to the aquifers above and below, $A_{-}^{i}(I)$ and $A_{+}^{i}(I)$, respectively. The average vertical-flow velocities above aquifers I and $A_{+}^{i}(I)$ are denoted by q_{I}^{i} and $q_{A_{+}^{i}(I)}^{i}$, respectively.

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237 2.3.2. Borehole vertical-flow velocities

Equation (15) provides an expression for the hydraulic head throughout a 238 connected aquifer in terms of the borehole vertical-flow velocities measured 239 above and below that aquifer. We now wish to use this result to develop 240 a general expression involving the flow velocities for a given set of fracture 241 hydraulic properties and their connection configuration. Assuming a lin-242 ear relationship between the vertical flow occurring during a cross-borehole 243 pumping or injection experiment and the difference in hydraulic head in 244 the borehole, the average flow velocity $q_I^i(t)$ in borehole i above aquifer I245

²⁴⁶ (Figure 2) can be expressed as

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$$q_I^i(t) = \beta_I^i \left(h_I^i - h_{I'}^i \right), \tag{16}$$

where we have introduced for the sake of notational clarity variable I' = 249 $A^i_{-}(I)$ denoting the overlying aquifer, and where h^i_I and $h^i_{I'}$ are the point 250 hydraulic head values in aquifers I and I' at the location of borehole i, 251 respectively. Expression (16) has been utilized in previous studies where 252 the term β_I^i is given by $\beta_I^i = \kappa^i / l_I^i$, with κ^i [m/s⁻¹] being the hydraulic 253 conductivity of borehole i and l_I^i [m] the vertical distance between aquifers 254 I and I' (Chen and Jiao, 1999; Cihan et al., 2011; Nordbotten et al., 2004). 255 In the present work, we assume that β_I^i can be deduced from the Hagen-256 Poiseuille law applied to the hydraulic head, meaning that $\beta_I^i = \frac{\rho g r_i^2}{8\mu l_I^i}$, where 257 r_i [m] is the borehole radius, g is [m s⁻²] the gravitational acceleration, and 258 $\rho \; [{\rm g} \; {\rm m}^{-3}]$ and $\mu \; [{\rm g} \; {\rm m}^{-1} \; {\rm s}^{-1}]$ are the density and dynamic viscosity of water, 259 respectively. Note, however, that expression (16) could be replaced by a 260 different relationship if the assumption of borehole laminar flow is deemed 261 unjustified (Chen and Jiao, 1999). 262

Equation (15) can be used to express the quantities h_I^i and $h_{I'}^i$ as

$$h_{I}^{i}(t) = h_{0,I}^{i} + \sum_{j=1}^{n_{I}} \left[Q_{A_{+}^{j}(I)}^{j} - Q_{I}^{j} \right] *_{t} \mathcal{H}_{I}^{i,j}$$
(17)

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$$h_{I'}^{i}(t) = h_{0,I'}^{i} + \sum_{j=1}^{n_{I'}} \left[Q_{A^{j}_{+}(I')}^{j} - Q_{I'}^{j} \right] *_{t} \mathcal{H}_{I'}^{i,j}$$
(18)

where index j is now used to sum over all of the boreholes intersecting the considered aquifer. Variable $\mathcal{H}_{K}^{i,j}$ in the above expressions is defined by equation (10) with $\mathcal{H}_{K}^{i,j} = \mathcal{H}_{K}^{j}(x_{i}, y_{i}, t - t')$, where (x_{i}, y_{i}) is the position of borehole *i*. Combining expressions (16), (17) and (18) leads to the following expression for the relative flow velocity Q_I^i :

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$$Q_{I}^{i}(t) = \beta_{I}^{i} \sum_{j=1}^{n_{I}} \left[Q_{A_{+}^{j}(I)}^{j} - Q_{I}^{j} \right] *_{t} \mathcal{H}_{I}^{i,j}$$
(19)

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$$-\beta_{I}^{i}\sum_{j=1}^{n_{I'}}\left[Q_{A^{j}_{+}(I')}^{j}-Q_{I'}^{j}\right]*_{t}\mathcal{H}_{I'}^{i,j}.$$

At the top of an observation well (e.g., flow velocity q_1^2 in Figure 1b), expression (16) cannot be used as it relies upon having an expression for the hydraulic head at the intersection of the well and an overlying fracture. In this case, the vertical flow occurring in the borehole is only due to wellbore storage and the flow velocity can be expressed as (*Lapcevic et al.*, 1993)

$$q_{I}^{282} \qquad \qquad q_{I}^{i}(t) = \frac{\partial h_{I}^{i}}{\partial t}.$$
(20)

Assuming steady-state equilibrium as the initial condition at the start of the cross-borehole experiment, the initial flow velocity at the top of the boreholes is zero and thus the relative flow velocity Q_I^i is equal to q_I^i . Expression (20) can then be combined with the hydraulic head expression (17), which leads to:

$$Q_I^i(t) = \sum_{j=1}^{n_I} \left[\partial_t Q_{A^j_+(I)}^j - \partial_t Q_I^j \right] *_t \mathcal{H}_I^{i,j}, \tag{21}$$

where ∂_t denotes the time derivative. At the top of the pumped borehole, the relative flow velocity is simply equal to $Q/(\pi r_1^2)$ where Q is the pumped flow rate and r_1 is the borehole radius.

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Equations (19) and (21) provide expressions for the transient relative vertical-flow velocities above the fractures in each borehole as a linear function of the other flow velocities. As such, the relative flow velocities can

be determined by solving the linear system Ax = b, where vector x con-297 tains the flow velocities discretized in time and matrix A depends upon the 298 fracture hydraulic properties, connectivity, and experimental geometry. Full 299 details on the formulation of this linear system and its semi-analytical im-300 plementation are provided in the Appendix. It is important to emphasize 301 that, despite the fact that equations (19) and (21) are linear with respect 302 to the relative flow velocities, the inverse problem involving the estimation 303 of aquifer hydraulic properties from cross-borehole vertical-flow measure-304 ments is highly non-linear because the hydraulic parameters of interest are 305 contained in matrix **A** and not in vector **x**. 306

307 3. Results and applications

308 3.1. Synthetic study

309 3.1.1. Experimental configurations

As a first example of the application of the modeling methodology for cross-310 borehole flow presented in Section 2, we consider two simple synthetic con-311 figurations involving two fractures and a single observation borehole. In the 312 first configuration (Figure 3a), the pumped and observation boreholes inter-313 sect both fractures. In the second configuration (Figure 3b), the observation 314 borehole intersects both fractures but the pumped borehole is connected to 315 only the first (upper) fracture. The upper and lower fractures are repre-316 sented in the model as confined aquifers having transmissivities T_1 and T_2 317 and storativities S_1 and S_2 , respectively. They are horizontal and located 318 at depths of 10 and 20 m for both configurations. The radius of the pumped 319 and observation wells is 3.75 cm and the distance between them is 20 m. 320 Hydraulic forcing of the system is conducted by extracting water at a rate of 321

³²² 8 L/min for 20 minutes at the top of the open pumped borehole. An absence ³²³ of vertical flow is assumed before the beginning of the pumping experiment ³²⁴ (i.e., no ambient flow for t < 0), and flow measurements are assumed to be ³²⁵ available over the course of pumping as well as for an additional 20 minutes ³²⁶ after pumping is stopped.



Figure 3: Two experimental configurations considered in our synthetic study, where the fractures have been represented as confined aquifers.

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Figure 4 shows the transient vertical flows in the observation borehole calculated using our model for the two configurations presented in Figure 3 and for fracture transmissivity values of $T_1 = T_2 = 10^{-5} \text{ m}^2/\text{s}$ and storativity values of $S_1 = S_2 = 10^{-5}$. Flow velocities (m/s) were converted into flow rates (L/min) for the figure. We observe that the vertical flow occurring above Aquifer 1 is identical for the configurations with and without connec-

tion, as this flow is determined by the properties of Aquifer 1. Conversely, 333 the flow occurring above Aquifer 2 depends on the connectivity. For the 334 configuration without connection, this flow is always positive (upwards) as 335 Aquifer 2 can contribute to the pumped flow only through the observation 336 borehole. In this case, the pumping impacts the hydraulic head in Aquifer 1, 337 which in turn impacts the hydraulic head in Aquifer 2. For the configura-338 tion with connection, as Aquifer 2 is connected to the pumped borehole, the 339 pumping directly influences the hydraulic head in this aquifer whereas the 340 hydraulic head in Aquifer 1 is affected by both the pumping and flow occur-341 ring above Aquifer 1. This implies that the flow occurring above Aquifer 2 342 is negative for this configuration.



Figure 4: Vertical-flow rate in the observation borehole above Aquifer 1 (black) and above Aquifer 2 (red) for the configurations with connection (solid lines) and without connection (dashed lines) in Figure 3. Note that the vertical flow occurring above Aquifer 1 is identical for the configurations with and without connection, hence the black solid and dashed lines are coincident.

344 3.1.2. Sensitivity analysis

Because the flow occurring above Aquifer 2 in the observation borehole 345 characterizes the connection configuration, we first demonstrate how our 346 semi-analytical modeling approach can be utilized to efficiently evaluate the 347 overall sensitivity of this particular flow to the hydraulic properties of both 348 aquifers. To this end, we again used the approach to calculate $q_2^{i_2}(t)$, but 349 this time for a wide range of hydraulic parameter values. Two grid searches 350 were performed. In the first, the logarithms of parameters T_1 and T_2 were 351 varied linearly over the range $[10^{-7}, 10^{-3}]$ m²/s while keeping S_1 and S_2 fixed 352 at 10^{-5} . In the second, the logarithms of S_1 and S_2 were varied over the 353 same range while keeping T_1 and T_2 fixed at 10^{-5} m²/s. For each parameter 354 combination, vertical-flow-velocity measurements were simulated every 240 355 seconds, yielding 10 discrete transient data. We hereby denote these data 356 by the vector $\mathcal{Q}_2^{i_2}$, which corresponds to the collection of temporal flow 357 velocities converted into flow rates (L/min). 358

Figure 5 shows the distribution of the ℓ^2 -norm of $\mathcal{Q}_2^{i_2}$ (denoted by $||\mathcal{Q}_2^{i_2}||$) 359 obtained from the grid searches for the two connection configurations in Fig-360 ure 3. In Figure 5a and b, we see that $||Q_2^{i_2}||$ is not sensitive to T_1 when T_2 is 361 less than 10^{-6} m²/s, in that it shows no significant variation over all of the 362 considered values of T_1 . This observation corresponds to cases where $\mathcal{Q}_2^{i_2}$ 363 is limited by the transmissivity of Aquifer 2 and thus does not depend on 364 the transmissivity of Aquifer 1. Figure 5a and b also show that the highest 365 sensitivity for both configurations (i.e., where we see the most significant 366 variation of $||Q_2^{\mathbf{i}_2}||$ occurs when $T_1 < T_2$. For the configuration with con-367 nection (Figure 5a), this corresponds to situations where Aquifer 2 supplies 368 an important part of the water required by the pumping experiment, which 369

may imply a strong decrease of the hydraulic head in Aquifer 2 in compari-370 son with Aquifer 1. This in turn leads to a downward flow above Aquifer 2, 371 as seen in Figure 6a where we plot the distribution of the sign of this flow 372 rate during pumping. The amplitude of the downward flow increases for 373 small values of T_1 , where the highest sensitivity of $||Q_2^{i_2}||$ is observed and 374 where the flow is mostly sensitive to T_2 (Figure 5a). For the configuration 375 without connection (Figure 5b), the pumping does not impact directly on 376 the hydraulic head in Aquifer 2. More precisely, it affects the hydraulic head 377 of Aquifer 1, which in turn affects the hydraulic head of Aquifer 2. This im-378 plies that small values of T_1 correspond to situations where the magnitude 379 of $\mathcal{Q}_2^{i_2}$ is limited by T_1 and not sensitive to T_2 . Conversely, when consid-380 ering large values of both T_1 and T_2 , Aquifer 2 contributes to the pumped 381 flow through the observation borehole and the highest sensitivity of $||Q_2^{i_2}||$ 382 is observed (Figure 5b). 383

Concerning the storage coefficients S_1 and S_2 , Figure 5c and d show that 384 $||\mathcal{Q}_{2}^{\mathbf{i}_{2}}||$ is small when the values of these two parameters are large for both 385 connection configurations. This corresponds to cases where the storativities 386 buffer the temporal response of the flow to pumping. For large values of 387 $S_2, ||\mathcal{Q}_2^{i_2}||$ is also seen to be highly sensitive to S_1 for both configurations 388 because Aquifer 1 reacts more quickly when its storativity is small, thereby 389 allowing for larger flows from Aquifer 2 to Aquifer 1. For the configuration 390 with connection, a similar high sensitivity to S_2 is observed for large values 391 of S_1 . As seen in Figure 6b, this behaviour corresponds to downward flow 392 and is thus specific to this configuration. For the configuration without 393 connection, Figure 5d shows that $||\mathcal{Q}_2^{\mathbf{i_2}}||$ is poorly sensitive to S_2 as the 394 behaviour of the flow is mainly determined by S_1 . 395

396

The above observations are in agreement with work conducted by *Pail*-



Figure 5: Distribution of $||Q_2^{i_2}||$ for the two configurations in Figure 3 as a function of (a and b) fracture transmissivity values with $S_1 = S_2 = 10^{-5}$, and (c and d) fracture storativity values with $T_1 = T_2 = 10^{-5}$ m²/s.

let (1998) involving similar simple fracture configurations and investigation of the nature of the vertical-flow velocities in the observation borehole for different hydraulic properties. In that paper, the main conclusions concerning the configuration without connection can be summarized as follows: (i) the flow between Aquifer 2 and Aquifer 1 is always upward; (ii) for $S_1 = S_2 = 10^{-5}$ and $T_1 = 10^{-5}$ m²/s, the magnitude of the flow velocity $q_2^{i_2}$ increases when T_2 increases (as seen in Figure 5b in our study); and (iii) for



Figure 6: Distribution of the sign of the flow rate $Q_2^{i_2}$ during pumping for the configuration in Figure 3a and as a function of (a) fracture transmissivity values and (b) fracture storativity values. Values in red are negative (downward flows) whereas those in blue are positive (upward flows).

⁴⁰⁴ $T_1 = T_2 = 10^{-5} \text{ m}^2/\text{s}$ and $S_1 = S_2$, increasing the value of the storativities ⁴⁰⁵ results in a decrease of the magnitude of $q_2^{i_2}$ (as seen in Figure 5d in our ⁴⁰⁶ study).

407 3.1.3. Inversion objective function

The sensitivity analysis presented above showed that, for the two simple 408 fracture configurations shown in Figure 3, measurements of the flow velocity 409 in the observation borehole contain important information regarding the 410 fracture hydraulic properties and connection configuration. Based on these 411 results, we now demonstrate the use of our modeling approach to examine 412 the objective function corresponding to the least-squares estimation of T_1 , 413 T_2 , S_1 , and S_2 from measurements of $q_1^{i_2}(t)$ and $q_2^{i_2}(t)$ in the observation 414 borehole. That is, using a grid search over the same parameter ranges as 415

⁴¹⁶ before, we now calculate and plot the sum-of-squares misfit

417
$$\mathcal{M} = \left\| \begin{bmatrix} \mathcal{Q}_{1}^{\mathbf{i}_{2}} - \mathcal{Q}_{1}^{\mathbf{i}_{2}, \mathbf{ref}} \\ \mathcal{Q}_{2}^{\mathbf{i}_{2}} - \mathcal{Q}_{2}^{\mathbf{i}_{2}, \mathbf{ref}} \end{bmatrix} \right\|^{2}, \qquad (22)$$

where $\mathcal{Q}_{1}^{\mathbf{i}_{2},\mathbf{ref}}$ and $\mathcal{Q}_{2}^{\mathbf{i}_{2},\mathbf{ref}}$ are the flow-rate vectors deduced from the transient flow velocities $q_{1}^{i_{2},ref}(t)$ and $q_{2}^{i_{2},ref}(t)$ corresponding to the "true" or reference set of hydraulic properties, and $\mathcal{Q}_{1}^{\mathbf{i}_{2}}$ and $\mathcal{Q}_{2}^{\mathbf{i}_{2}}$ are the flow rate vectors predicted for specific values of T_{1}, T_{2}, S_{1} , and S_{2} . The goal of an inversion is to find one or more sets of hydraulic properties that minimize \mathcal{M} to within an acceptable degree.

It is important to note that the analysis performed below should in no 425 way be taken to represent a comprehensive assessment of the cross-borehole 426 flow inverse problem, but rather an example of how our semi-analytical 427 modeling approach can be used to efficiently examine the nature of the 428 inversion objective function to glean information regarding the potential 429 non-uniqueness of the solution and corresponding uncertainty. Indeed, the 430 fracture configurations considered in Figure 3 are far too simple to represent 431 the vast majority of real-world scenarios, and significantly different results 432 should be expected as the number of fractures increases and the geometry 433 becomes more complex. This is explored in further detail in our analysis of 434 field data in Section 3.2. 435

Figure 7a and b show the distribution of the sum-of-squares misfit function in equation (22) for the two connection configurations in Figure 3 assuming "true" parameter values of $T_1^{ref} = T_2^{ref} = 10^{-5} \text{ m}^2/\text{s}$ and $S_1^{ref} =$ $S_2^{ref} = 10^{-5}$. In Figure 7a the transmissivities are varied while the storativities are held fixed at their true values, whereas in Figure 7b the storativities are varied while holding T_1 and T_2 at their true values. Note the

similarity in overall character between Figure 7 and the sensitivity analysis 442 results in Figure 5, which suggests that flow measurements above Aquifer 2 443 in the observation borehole will have a strong control on the set(s) of hy-444 draulic parameters obtained through inversion. Also note that the shape 445 of the objective function is clearly different between the two configurations. 446 Specifically, the minimum of \mathcal{M} is rather well defined for the configuration 447 with connection, whereas a more complex, elongated form is observed for the 448 configuration without connection. The latter indicates that the existence of 449 a unique and/or easily resolvable minimum is questionable in the uncon-450 nected case. For example, the limited change in \mathcal{M} with varying S_2 over the 451 minimum region in Figure 7d implies that it will be difficult to resolve the 452 latter parameter, especially considering the presence of data measurement 453 uncertainties in a realistic scenario. 454

455 3.2. Field study

To demonstrate the utility of the developed semi-analytical modeling ap-456 proach in a field context, we now consider the analysis and inversion of 457 cross-borehole flow data acquired in the Melechov Granite at the Bohemian-458 Moravian Highland in Czech Republic. These data were previously pre-459 sented and analyzed by *Paillet et al.* (2012), which provides a basis for 460 comparing our results with those obtained using their semi-quantitative 461 modeling methodology. Figure 1a shows the flow experiment and overall 462 fracture geometry at the site, the latter of which was inferred from borehole 463 measurements. The radius of the two boreholes is 3.75 cm and the distance 464 between them is 21 m. For further details concerning the determination of 465 the number of fractures and their position in each borehole, please see *Pail*-466 let et al. (2012). Connections between fractures viewed at similar depths 467



Figure 7: Distribution of the sum-of-squares misfit objective function in equation (22) $[(L/min)^2]$ for the two connection configurations in Figure 3 as a function of (a and b) fracture transmissivity values with $S_1 = S_2 = 10^{-5}$, and (c and d) fracture storativity values with $T_1 = T_2 = 10^{-5}$ m²/s. The white crosses represent the reference or "true" parameter values and the black lines represent the contours of the objective function.

are shown as initially postulated by *Paillet et al.* (2012), which leads to the equivalent aquifer representation shown in Figure 1b. During the flow experiment, an extraction rate of 17.8 L/min was applied for 20 minutes to the pumped borehole and the flow velocities above each identified fracture in the observation borehole were recorded every minute over this period, as ⁴⁷³ well as for an additional 20 minutes thereafter.

In testing of the connection configuration illustrated in Figure 1b in 474 the context of their semi-quantitative approach, Paillet et al. (2012) found 475 that, although fractures were observed at similar depths in both the pumped 476 and observation boreholes between 52-56 m, 91-96 m, and 136-148 m, it is 477 highly unlikely that the boreholes are actually hydraulically connected at 478 all of these locations. In particular, the fractures between 52-56 m were 479 thought to be very likely connected, the fractures between 136-148 m depth 480 to be very likely not connected, and the connectivity between 91-96 m to be 481 uncertain. For this reason, in their analysis of the fracture hydraulic prop-482 erties from the Melechov Granite field data, Paillet et al. (2012) chose to 483 consider two different connection configurations from the one shown in Fig-484 ure 1b. In the first, only one connection was assumed between the pumped 485 and observation boreholes through Aquifer 2. In the second, both Aquifers 2 486 and 3 were assumed to provide hydraulic connection between the boreholes. 487 In the present study, we follow along the same lines and perform our inver-488 sion for the aquifer hydraulic properties assuming the latter two connection 489 configurations, which we hereby refer to as Model 1 (Figure 8a) and Model 2 490 (Figure 8b), respectively. 491

Given the five fractures intersecting the observation borehole, a total of 492 five transmissivities and storativities needed to be estimated from the tran-493 sient vertical-flow velocity measurements for each connection configuration. 494 To this end, we used our developed modeling approach within a non-linear 495 least-squares inversion framework to minimize the sum-of-squares misfit be-496 tween the measured data and those predicted using a prescribed set of values 497 for the aquifer hydraulic properties. The optimization was accomplished us-498 ing the trust-region-reflective algorithm implemented in Matlab (Coleman 499



Figure 8: Connexion configurations considered in our field study, where the pumped and observation boreholes are connected through (a) Aquifer 2 (Model 1), and (b) Aquifers 2 et 3 (Model 2).

and Li, 1994, 1996), which requires a starting point for the inversion and permits the parameter search intervals to be restricted if desired. For each connectivity configuration, 10 inversions were conducted based on different starting points, yielding 10 estimates of the hydraulic properties. The inversion starting points were selected randomly from a uniform distribution for the logarithm of the transmissivity in the range $[10^{-7}, 10^{-3}]$ m²/s, and for the logarithm of the storativity in the range $[10^{-7}, 10^{-3}]$.

Figure 9 shows the distribution of the inversion estimates versus starting points for the transmissivities and storativities for Models 1 and 2. Inver-

sion results leading to lower sum-of-squares misfits (with objective function 509 values less than 2 $(L/min)^2$) are shown in red. We see in the figure that, 510 in general, the highly different inversion starting points lead to similar es-511 timates of the transmissivities, but very different estimates of the stora-512 tivities. In Figure 9a, for example, the starting points for transmissivity 513 T_1 for Model 1 leading to the lower objective function values (red circles) 514 vary over two orders of magnitude (from 1.76×10^{-6} to 1.81×10^{-4} m²/s), 515 whereas the corresponding inversion estimates vary only from 1.34×10^{-5} 516 to 1.71×10^{-5} m²/s. Considering the other results for T_1 (green circles), 517 we see a similar behaviour but with convergence of the estimates around 518 a different (higher) value, suggesting the presence of two objective function 519 minima, one of which provides a significantly better fit to the observed data. 520 Similar results are seen for the other transmissivities in Figure 9a, as well 521 as for the transmissivities corresponding to Model 2 in Figure 9b, in that 522 vastly different values for the starting points lead to a relatively narrow clus-523 tering of the estimates around a small number of values. With regard to the 524 storativity, on the other hand, we observe in Figure 9c and d that the re-525 sults of the 10 inversions lead to very different parameter estimates that are 526 distributed over many orders of magnitude. That is, there is no clear clus-527 tering of storativity values in distinctive regions. For example, in Figure 9c 528 we see that both the starting points and estimates for the storativity S_1 for 529 Model 1 are distributed over more than two orders of magnitude, even for 530 the points corresponding to the lower misfit values. In agreement with the 531 results of our synthetic investigation, the above findings suggest that cross-532 borehole flow inversions will do a better job of estimating transmissivities 533 than storativities. It appears, as well, that configurations characterized by 534 connections between the pumped and observation boreholes may allow for 535

⁵³⁶ better determination of aquifer hydraulic properties. Indeed, the ranges of
⁵³⁷ variation of the storativity estimates are smaller for Model 2 than Model 1,
which was also clearly observed in our synthetic study.



Figure 9: Distribution of the estimates of (a and b) the transmissivity (T_e) and (c and d) the storativity (S_e) obtained through inversion versus the corresponding randomly chosen inversion starting points, T_{sp} and S_{sp} . Results for connectivity Model 1 (left column) and Model 2 (right column) are shown. The sum-of-squares misfit objective function corresponding to these estimates ranged from 1.23 to 4.08 $(L/min)^2$ for Model 1 and from 0.98 to 4.03 $(L/min)^2$ for Model 2. Red symbols indicate parameter estimates resulting in an objective function value of less than 2 $(L/min)^2$.

Finally, we present in Figure 10 the relative vertical flow calculated at 539 different depths in the observation borehole using our semi-analytical ap-540 proach for connectivity Models 1 and 2, along with the corresponding mea-541 sured data. For each connection configuration, the two best-fitting sets of 542 predicted data are shown, whose hydraulic properties are given in Table 1. 543 Overall, the best fit between the predicted and observed data is obtained 544 using Model 2 and Parameter Set 2 (thick black curve in Figure 10). Key 545 characteristics of this particular configuration are (i) the assumption of a 546 connection between the pumped and observation boreholes through Aquifer 547 3, in contrast with Model 1 which only allows connection through Aquifer 2; 548 and (ii) a large value for the storativity S_1 and small values for S_3 and S_4 , 549 in comparison with Model 2, Parameter Set 1. These characteristics allow 550 us to reproduce the sudden change in flow observed between 52-91 m depth 551 immediately after the pumping was stopped (Figure 10b at t = 20 min), as 552 well as the negative flow rate in the same depth interval at the beginning 553 of the pumping experiment. In comparison with the study conducted by 554 Paillet et al. (2012), this represents a closer reproduction of the measured 555 data and demonstrates the important impact of fracture storativities. In 556 their investigation, storativity was assumed to be important as the authors 557 suspected that the negative flow rate at the beginning of the pumping exper-558 iment resulted from a small storativity in Aquifer 3. However, because they 559 considered a single constant value for the storativity in all fractures, this 560 assumption could not be fully tested. The results presented here indicate 561 that storativity is indeed important and validate the assumption previously 562 563 made.



Figure 10: Relative flow rate in the observation borehole at different depths for the Melechov Granite field study. Shown are the measured data (blue crosses) and the data predicted using our semi-analytical modeling approach assuming connectivity Model 1 (red lines) and Model 2 (black lines). Results for the two best-fitting sets of hydraulic properties (Table 1) are shown. The thick black line indicates the overall best-fitting predicted data, which were obtained assuming connectivity Model 2 and Parameter Set 2.

564 4. Conclusions

We have developed in this paper a new semi-analytical modeling approach for cross-borehole flow experiments in fractured media, which takes the form of a linear system that must be solved to obtain the vertical-flow velocities above each fracture. The speed and accuracy of this approach make it an ideal tool for sensitivity analysis, where many data must be calculated over a wide range of model parameter configurations. Indeed, simple sensitivity analyses, such as the one conducted in our synthetic study, can provide im-

	Model 1, Set 1	Model 1, Set 2	Model 2, Set 1	Model 2, Set 2
T_1	1.7×10^{-5}	1.7×10^{-5}	1.5×10^{-5}	1.7×10^{-5}
T_2	4×10^{-7}	2×10^{-7}	5×10^{-7}	7.9×10^{-7}
T_3	2.2×10^{-5}	2.2×10^{-5}	1.3×10^{-5}	3.3×10^{-5}
T_4	1.6×10^{-6}	1.6×10^{-6}	2.7×10^{-6}	4.4×10^{-6}
T_5	6×10^{-7}	$5 imes 10^{-7}$	1.1×10^{-6}	$1.6 imes 10^{-6}$
S_1	10 ⁻⁷	10^{-7}	2×10^{-7}	1.6×10^{-5}
S_2	2×10^{-7}	2×10^{-7}	3×10^{-7}	4.6×10^{-7}
S_3	2×10^{-7}	3×10^{-7}	$3.3 imes 10^{-4}$	10^{-7}
S_4	$6.7 imes 10^{-4}$	$9.1 imes 10^{-4}$	10^{-6}	$1.1 imes 10^{-7}$
S_5	7.4×10^{-4}	9.3×10^{-4}	4×10^{-7}	2.4×10^{-7}
\mathcal{M}	1.2374	1.2318	1.2961	0.9789

Table 1: Two best-fitting sets of transmissivity $[m^2/s]$ and storativity [-] estimates, along with the corresponding values for the sum-of-squares misfit (\mathcal{M}), for our field example. Results are shown for connectivity Models 1 and 2 presented in Figure 8.

portant insight into parameter identifiability. For example, we found in our 572 case that the highest sensitivity of the borehole flow data is observed when 573 the transmissivity of the upper fracture was smaller than the transmissivity 574 of the lower fracture, as well as that the connection configuration strongly 575 affected the sensitivity to both the transmissivities and the storativities. We 576 also observed in our inverse analysis of the Melechov Granite field data the 577 important role of fracture storativity and how estimating this parameter for 578 each fracture can allow for significantly improved fits to the measured data. 579 As future extensions of this work, further investigation of the cross-borehole 580 flow inverse problem should be considered for more complex fracture con-581 figurations, where the "true" connectivity and hydraulic properties of the 582

583 system are known.

It is important to emphasize that our derived semi-analytical formulation 584 is based upon a simplified geological representation, where fractures are 585 modeled as equivalent confined aquifers. Although such a representation has 586 been considered in previous work and clearly allows us to obtain meaningful 587 results, it could be modified with further development to better account for 588 realistic subsurface structure. For example, it may be possible to consider 589 vertical fractures connecting horizontal fractures between the boreholes as 590 localized leakages in our model, where the corresponding hydraulic head 591 would be related to the properties of the vertical fractures. In addition, 592 although the examples presented here focused on two-borehole experiments, 593 our formulation can be easily used to model experiments involving more than 594 one observation well. Finally, in terms of geological structure representation, 595 it may be possible to model the coexistence of fractures and rock and the 596 impact of their related properties with suitable modification. For example, 597 the rock matrix may also provide an important source of storage, resulting 598 in dual-porosity behaviour, which would evidently require coupling of the 599 equations related to the fracture and matrix parts of the system. This could 600 possibly lead to an even better fit of measured field data. 601

Additional extensions to this work include the development of stochas-602 tic inversion strategies for interpreting cross-borehole flow experiments as 603 well for performing uncertainty quantification. The first investigations con-604 ducted in this paper demonstrate the potential complexity of the inverse 605 problem, with the possibility of several minima in the objective function 606 for complex fracture networks. Thus, inversion strategies allowing for the 607 possibility of multiple plausible hydraulic parameter and connection config-608 urations are needed, especially if realistic data measurement uncertainties 609

are to be considered. Detailed prior information can also help to resolve the 610 non-uniqueness of the inverse problem. In this regard, in addition to infor-611 mation obtained from geophysical logs used for identifying the position of 612 fractures that intersect the boreholes, information from single-hole steady-613 state tests could be useful for constraining the connectivity and hydraulic 614 property estimates. Although past work has focused on manual calibration 615 of borehole flow models, stochastic methods hold great potential to aid in 616 data analysis. 617

618 Appendix: Semi-analytical implementation

619 Global and local numbering

Considering a system of n boreholes where each borehole i (i = 1, ..., n)intersects N_i aquifers, we aim to determine the N_{flow} borehole vertical-flow velocities in the system where

$$N_{flow} = \sum_{i=1}^{n} N_i.$$
(23)

For the example in Figure 1b, the system is characterized by n = 2 boreholes where the pumped (i = 1) and observation (i = 2) boreholes intersect three $(N_1 = 3)$ and five $(N_2 = 5)$ aquifers, respectively. This implies that eight vertical-flow velocities $(N_{flow} = 8)$ must be defined.

Considering a domain containing a total of N aquifers, we define (i) a global aquifer numbering scheme (I = 1, ..., N) from the top to the bottom of the domain, and (ii) a local numbering scheme relative to each borehole where the function $f_i(I)$ returns the local numbering of aquifer I relative to borehole i. Again for the example in Figure 1b, the aquifers are globally numbered from 1 to 5 and locally numbered with the functions $f_1(I)$ and $f_2(I)$ for the pumped and observation boreholes, respectively. As the observation borehole intersects all of the aquifers of the system, the local numbering for this borehole is the same as the global numbering and we have $f_2(I) = I$. However, because the pumped borehole intersects only three of the five aquifers, its local numbering is given by $f_2(2) = 1$, $f_2(3) = 2$ and $f_2(5) = 3$. To obtain the global numbering of an aquifer from its local numbering, we also define the inverse function g, where $g_i[f_i(I)] = I$.

642 Linear system construction

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The vertical-flow velocity expressions developed in Section 2.3.2 can be written as a linear system $\mathbf{A}\mathbf{x} = \mathbf{b}$, where unknown vector \mathbf{x} contains the transient velocities discretized in time and matrix \mathbf{A} depends upon the fracture hydraulic properties, connectivity, and experimental geometry. In our construction of this linear system, we consider \mathbf{x} to be comprised of n sub-vectors corresponding to each borehole as follows:

$$\mathbf{x} = \begin{bmatrix} \mathbf{x}^1 \\ \vdots \\ \mathbf{x}^n \end{bmatrix}.$$
 (24)

Each \mathbf{x}^i in turn consists of N_i sub-vectors representing the different transient flow velocities in borehole *i*. That is,

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$$\mathbf{x}^{i} = \begin{bmatrix} \mathbf{x}^{i}_{g_{i}(1)} \\ \vdots \\ \mathbf{x}^{i}_{g_{i}(N_{i})} \end{bmatrix}, \qquad (25)$$

where vector \mathbf{x}_{I}^{i} $(I = g_{i}(1), ..., g_{i}(N_{i}))$ contains the time-discretized relative flow velocity Q_{I}^{i} . Considering time to be discretized into n_{t} intervals and thus expressed as $t_k = k\Delta t$ $(k = 1, ..., n_t)$ with time step Δt , we have

$$\mathbf{x}_{I}^{i} = \begin{bmatrix} Q_{I}^{i}(t_{1}) \\ \vdots \\ Q_{I}^{i}(t_{n_{t}}) \end{bmatrix}.$$
(26)

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⁶⁶⁰ This implies that the total length of vector \mathbf{x} is given by $n_t \times N_{flow}$.

In order to construct matrix **A** and vector **b**, we first note that the convolution product $Q_K^j *_t \mathcal{H}_I^{i,j}$ ($K = I, I', A_+^j(I), A_+^j(I')$) found in expression (19) can be discretized and expressed at time t_k as

$$(Q_K^j * \mathcal{H}_I^{i,j})(t_k) = \sum_{l=1}^k \int_{t_{l-1}}^{t_l} Q_K^j(t') \mathcal{H}_I^j(x_i, y_i, t_k - t') \mathrm{d}t'$$

$$(27)$$

666 with $t_0 = 0$. This can be approximated as

$$\left(Q_K^j * \mathcal{H}_I^{i,j}\right)(t_k) = \sum_{l=1}^k Q_K^j(t_{l-1/2}) \mathcal{H}_{I,k,l}^{i,j}$$
(28)

669 where

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$$Q_{K}^{j}(t_{l-1/2}) = \left[Q_{K}^{j}(t_{l-1}) + Q_{K}^{j}(t_{l})\right]/2$$
(29)

672 and

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$$\mathcal{H}_{I,k,l}^{i,j} = \int_{t_{l-1}}^{t_l} \mathcal{H}_{I}^{j}(x_i, y_i, t_k - t') \mathrm{d}t'.$$
(30)

⁶⁷⁵ The previous expression is evaluated as

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$$\mathcal{H}_{I,k,l}^{i,j} = \frac{1}{4\pi T_I} \int_{C_j} \left[E_1(\gamma/t_{k-l+1}) - E_1(\gamma/t_{k-l}) \right] \mathrm{d}x' \mathrm{d}y', \tag{31}$$

678 where

$$E_{1}(\gamma/t) = \int_{0}^{t} \frac{e^{-\gamma/\tau}}{\tau} d\tau$$
(32)

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$$\gamma = \frac{(x_i - x')^2 + (y_i - y')^2}{4\alpha_I}.$$
(33)

⁶⁸⁴ The integrals over space are then expressed as

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$$\int_{C_j} E_1(\gamma/t) dx' dy' =$$
(34)
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$$\int_0^{2\pi} \int_0^{r_j} r' E_1 \left[\frac{(x_{i,j} - r' \cos \theta')^2 + (y_i - r' \sin \theta')^2}{4\alpha_I t} \right] dr' d\theta'$$

where $x_{i,j} = x_i - x_j + x_1$, with x_1 defined as the origin of the x-coordinate. Note that y_i can be set to 0 when considering only two boreholes. Also note that the integrals over space in expression (31) are evaluated numerically when $i \neq j$, and analytically when i = j.

⁶⁹² The convolution product $\partial_t Q_K^j *_t \mathcal{H}_I^{i,j}$ $(K = I, A_+^j(I))$ found in expres-⁶⁹³ sion (21) can be discretized and expressed at time t_k as

$$\left(\partial_t Q_K^j *_t \mathcal{H}_I^{i,j}\right)(t_k) = \sum_{l=1}^k \partial_t Q_K^j(t_{l-1/2}) \mathcal{H}_{I,k,l}^{i,j}$$
(35)

where the time derivative $\partial_t Q_K^j(t_{l-1/2})$ is approximated as

$$\partial_t Q_K^j(t_{l-1/2}) = \left[Q_K^j(t_l) - Q_K^j(t_{l-1}) \right] / \Delta t.$$
(36)

Let us now define index $m_{i,I,k}$ related to borehole *i*, aquifer *I*, and discretized time t_k as follows:

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$$m_{i,I,k} = \sum_{j=1}^{i-1} N_j \times n_t + f_i(I-1) \times n_t + k.$$
(37)

Matrix **A** and vector **b** can now be defined for $i = 1, ..., n, I = g_i(1), ..., g_i(N_i)$ and $k = 1, ..., n_t$ as follows: For i = 1 (pumped well) and $I = g_i(1)$ (the first aquifer intersected by this well):

$$A(m_{i,I,k}, m_{i,I,k}) = 1$$
(38)

709 and

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$$b(m_{i,I,k}) = \begin{cases} \mathcal{Q}/(\pi r_1^2), & k\Delta t \le t^* \\ 0, & k\Delta t > t^* \end{cases}$$
(39)

where Q is the pumping rate, r_1 is the radius of the pumped borehole, and t^* is the pumping time.

For i = 2, ..., n (observation wells) and $I = g_i(1)$ (the first aquifer intersected by these wells), expression (21) leads to:

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$$A(m_{i,I,k}, m_{j,J,l}) = \begin{cases} 1, & j = i, J = I, l = k \\ \mathcal{H}_{I,k,l}^{i,j} / \Delta t, & j = 1, ..., n_I, J = I, \\ & l = 1, ..., k \\ -\mathcal{H}_{I,k,l}^{i,j} / \Delta t, & j = 1, ..., n_I, J = A_+^j(I), \\ & J \neq N_j, l = 1, ..., k \end{cases}$$
(40)

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$$A(m_{i,I,k}, m_{j,J,l-1}) = \begin{cases} -\mathcal{H}_{I,k,l}^{i,j}/\Delta t, \quad j = 1, ..., n_I, J = I, \\ l = 2, ..., k \\ \mathcal{H}_{I,k,l}^{i,j}/\Delta t, \quad j = 1, ..., n_I, J = A_+^j(I), \\ J \neq N_j, l = 2, ..., k \end{cases}$$
(41)

721 and

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$$b(m_{i,I,k}) = 0.$$
 (42)

Finally, for i = 1, ..., n and $I = g_i(2), ..., g_i(N_i)$, expression (19) leads to:

$$A(m_{i,I,k}, m_{j,J,l}) = \begin{cases} 1, & j = i, J = I, l = k \\ \beta_I^i \mathcal{H}_{I,k,l}^{i,j}/2, & j = 1, ..., n_I, J = I, \\ l = 1, ..., k \\ -\beta_I^i \mathcal{H}_{I,k,l}^{i,j}/2, & j = 1, ..., n_I, J = A_+^j(I), \\ J \neq N_j, l = 1, ..., k \\ -\beta_I^i \mathcal{H}_{I',k,l}^{i,j}/2, & j = 1, ..., n_{I'}, J = I', \\ J \neq N_j, l = 1, ..., k \\ \beta_I^i \mathcal{H}_{I',k,l}^{i,j}/2, & j = 1, ..., n_{I'}, J = A_+^j(I'), \\ J \neq N_j, l = 1, ..., k \end{cases}$$
⁷²⁶

$$A(m_{i,I,k}, m_{j,J,l-1}) = \begin{cases} \beta_I^i \mathcal{H}_{I,k,l}^{i,j}/2 & j = 1, ..., n_I, J = I, \\ l = 2, ..., k \\ -\beta_I^i \mathcal{H}_{I,k,l}^{i,j}/2 & j = 1, ..., n_I, J = A_+^j(I), \\ J \neq N_j, l = 2, ..., k \\ -\beta_I^i \mathcal{H}_{I',k,l}^{i,j}/2 & j = 1, ..., n_{I'}, J = I', \\ J \neq N_j, l = 2, ..., k \\ \beta_I^i \mathcal{H}_{I',k,l}^{i,j}/2 & j = 1, ..., n_{I'}, J = A_+^j(I'), \\ J \neq N_j, l = 2, ..., k \end{cases}$$
(44)

730 and

 $b(m_{i,I,k}) = 0.$ (45)

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