1	Seismic signatures of partial steam
2	saturation in fractured geothermal
3	reservoirs: insights from poroelasticity
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ABSTRACT

Detecting the presence of gaseous formation fluids, estimating the respective volumes, 10 and characterizing their spatial distribution is important for a wide range of appli-11 cations, notably for geothermal energy production. The ability to obtain such infor-12 mation from remote geophysical measurements constitutes a fundamental challenge, 13 which needs to be overcome to address a wide range of problems, such as the estima-14 tion of the reservoir temperature and pressure conditions. With these motivations, 15 we compute the body wave velocities of a fractured granitic geothermal reservoir for-16 mation with varying quantities of steam to analyze the seismic signatures in a partial 17 saturation context. We employ a poroelastic upscaling approach that accounts for 18 mesoscale fluid pressure diffusion (FPD) effects induced by the seismic strain field, 19 and, thus, describes the governing physical processes more accurately than standard 20 representations. Changes in seismic velocities due to steam saturation are compared 21 with changes associated with fracture density variations, as both are plausible re-22 sults of pressure changes in geothermal reservoirs. We find that steam saturation 23 has a significant impact on P-wave velocities while affecting S-wave velocities to a 24 significantly lesser extent. This contrasting behavior allows to discriminate between 25 fracture density and steam saturation changes by means of P- and S-wave velocity 26 ratio analyses. To evaluate the potential of seismic methods to provide this informa-27 tion, a canonical geothermal reservoir model is employed to compute Rayleigh wave 28 velocity dispersion and seismic reflection amplitude vs angle (AVA) curves. These 29 studies reveal that AVA analyses allow to differentiate changes in fracture density 30

from changes in steam saturation. We also note that Rayleigh-wave-based techniques are much less sensitive to steam content changes than to fracture density changes. Comparisons with elastic approaches show that including FPD effects through the use of a poroelastic model is crucial for the reliable detection and characterization of steam in fractured geothermal reservoirs.

## INTRODUCTION

The remote detection and characterization of the presence of gaseous phases in frac-36 tured geological formations is essential for numerous applications of economic and 37 environmental importance, such as, for example, the monitoring of  $CO_2$  sequestra-38 tion projects or the identification of gas pockets in hydrocarbon reservoirs (e.g., Fatti 39 et al., 1994; Kazemeini et al., 2010; Roach et al., 2015; Stork et al., 2018). In partic-40 ular, the detection of the presence or absence of steam in high-enthalpy geothermal 41 reservoirs can provide unique insights with regard to the system's temperature and 42 pressure conditions (e.g., Scott, 2020). Most high-enthalpy geothermal reservoirs are 43 associated with fractured environments. Open fractures are weak and permeable fea-44 tures that tend to constitute preferential pathways for fluid flow and, thus, greatly 45 affect the overall hydraulic and mechanical properties of the medium. Correspond-46 ingly, seismic methods are extensively used for the characterization and monitoring 47 of geothermal projects (e.g., Gunasekera et al., 2003; Obermann et al., 2015; Taira 48 et al., 2018; Sánchez-Pastor et al., 2021; Toledo et al., 2022). 49

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Fractures prevail over a wide range of scales (e.g., Vermilye and Scholz, 1995; Bon-

net et al., 2001), from the regional scale all the way to the microscopic one. Seismic 51 waves travelling through fractured media tend to experience an increase in attenua-52 tion, dispersion, and scattering as well as a general decrease in the overall propaga-53 tion velocity. The relative scale of the fractures with respect to the prevailing seismic 54 wavelengths determines which physical mechanisms dominate. Mesoscale fractures, 55 which are the focus of this study, are much smaller than the prevailing wavelengths, 56 but much larger than the pore scale. Fractures in this scale range do not promote 57 significant scattering and are well below the explicit resolution of seismic exploration 58 techniques, but they do manifest themselves through pronounced increases of attenua-59 tion and dispersion. Given the seemingly universal hyperbolic distribution of fracture 60 lengths (e.g., de Dreuzy et al., 2001; Bonnet et al., 2001), mesoscale fractures tend to 61 be particularly abundant and play a correspondingly important role with regard to 62 the effective hidraulic properties of fractured reservoirs. When a seismic wave trav-63 els through a formation containing mesoscale fractures, por fluid pressure gradients 64 arise between the softer fractures and the stiffer embedding background as well as 65 between interconnected fractures (e.g., Rubino et al., 2013, 2014, 2016; Vinci et al., 66 2014; Gurevich et al., 2009). These pressure imbalances cause fluid pressure diffusion 67 (FPD) between the fractures and their embedding background known as fracture-68 to-background FPD, as well as between connected fractures, known as fracture-to-69 fracture FPD. The corresponding effects manifest themselves in the form of seismic 70 attenuation and velocity dispersion. The governing physical processes can be assessed 71 using Biot's (1962) theory of poroelasticity, which permits to comprehensively char-72 acterize FPD effects induced by the strains associated with seismic waves. However, 73

the numerical simulation of wave propagation accounting for the effects of mesoscale fractures on seismic attenuation and dispersion is computationally prohibitive, due to the very fact that the scale, at which these effects prevail, is much smaller than the seismic wavelengths (e.g., Rubino et al., 2016). To circumvent this problem, effective-medium-type upscaling approaches have proven to be an efficient means of characterizing FPD effects in formations containing mesoscale heterogeneities and/or fractures.

In the context of effective-medium-type upscaling approaches, a representative 81 sample of the formation of interest is subjected to a series of numerical stress or 82 displacement tests in order to emulate the deformation imposed by a propagating 83 seismic wavefield (e.g., Masson and Pride, 2007; Rubino et al., 2009). The resulting 84 stress and strain fields are then used to infer the equivalent phase velocity and at-85 tenuation for the medium. In the recent past, these upscaling approaches have been 86 successfully employed to explore FPD effects in mesoscale fractured media of increas-87 ing complexity and realism (e.g., Rubino et al., 2013, 2017; Hunziker et al., 2018). 88 Most of the above mentioned works were, however, based on the assumption of full 89 water saturation. Conversely, in high-enthalpy geothermal systems, it is important to 90 assess the effects of partial saturation, as steam may be present due to natural causes 91 (e.g., Scott, 2020) or due to decompression effects during production operations (e.g., 92 Barbier, 2002). 93

The presence of steam in geothermal reservoirs is governed by the local pressure and temperature conditions, and, thus, it is of interest to assess whether seismic

methods can provide relevant information in this regard. Grab et al. (2017) studied 96 the seismic effects of partial steam saturation in a fractured geothermal reservoir. 97 To do so, the authors considered that the steam phase is distributed in the form 98 of sub-pore-scale bubbles throughout primarily water-saturated fractures and their 99 embedding background. As such, the authors represent the properties of the corre-100 sponding gas-liquid mixture as an effective fluid for the purposes of modelling. There 101 is, however, evidence to show that the spatial distribution of wetting and non-wetting 102 fluids, such as water and steam, in fractured formations is partly determined by cap-103 illary forces (e.g., Glass et al., 2004). This characteristic, in turn, implies that steam 104 should preferentially concentrate in fractures, as they constitute regions with partic-105 ularly low entry pressures. Taking this fluid distribution characteristic into account, 106 Solazzi et al. (2020) analyzed the effects of fracture-to-background and fracture-to-107 fracture FPD processes in a brine- and  $CO_2$ -saturated fractured formation. The 108 authors show that the amount and the spatial distribution of the fluid phases have 109 a significant effect on seismic velocity and attenuation estimates for both P- and S-110 waves. Conversely, the importance of these effects in scenarios with varying fracture 111 densities and connectivities, which have been identified as key variables with regard 112 to the seismic response of monosaturated media, remains as of yet unexplored. 113

The objective of this study is to improve our understanding of the seismic response of partially saturated fractured media in general and high-enthalpy fractured geothermal reservoirs in particular. To this end, we focus on the presence or absence of steam in high-enthalpy fractured geothermal reservoirs and explore the correspond-

ing impact on seismic characterization and monitoring efforts. Throughout this study, 118 changes in seismic velocities due to steam saturation are compared with changes asso-119 ciated with pure fracture density variations, as both saturation and fracture density 120 changes are plausible results of pressure changes in geothermal reservoirs. The paper 121 proceeds as follows. First, we present the methodological background related to the 122 generation of poroelastic models of partially saturated fractured media and for eval-123 uating their effective seismic properties by accounting for the prevailing FPD effects. 124 Then, we analyze the resulting behavior of P- and S-wave velocities as functions of 125 the steam saturation of the fractures and their interconnectivity degree. These re-126 sults are compared to those corresponding to the high-frequency limit, which does 127 not account for FPD effects. Based on these results, we then consider a canonical 128 geological model and study the sensitivity of Rayleigh waves and variations of seismic 129 reflection amplitudes with incidence angle (AVA) with regard to these parameters. As 130 previously mentioned, we also explore whether time-lapse seismic monitoring has the 131 potential of differentiating between changes in fracture density and steam saturation. 132

## METHODOLOGY

<sup>133</sup> In this section, we provide a summary of the numerical upscaling procedure employed <sup>134</sup> to obtain effective seismic properties of poroelastic samples containing mesoscale frac-<sup>135</sup> tures. We then describe how we generate realistic fracture networks with different <sup>136</sup> levels of fracture interconnectivity and varying fracture fluid content. Finally, we pro-<sup>137</sup> vide an overview of FPD effects in fractured media and their impact on key seismic

138 characteristics.

## <sup>139</sup> Numerical Upscaling Procedure

To obtain effective seismic properties of a porous medium containing mesoscale frac-140 tures, we consider a typical sample of the corresponding medium and subject it to a 141 set of numerical tests consisting of harmonic displacements applied on its boundaries 142 (e.g., Rubino et al., 2009). The response of the samples are evaluated using Biot's the-143 ory of poroelasticity, which naturally accounts for FPD effects (Biot, 1956a,b). The 144 rock samples contain mesoscopic fractures that are conceptualized as highly porous, 145 highly permeable, and highly compliant inclusions embedded in a much stiffer and 146 much less porous and permeable background (e.g., Nakagawa and Schoenberg, 2007). 147 It is worth noting that, even in presence of media with very low porosities and perme-148 abilities, the theory of poroelasticity remains valid and that, for sufficiently low values 149 of these properties, the medium effectively behaves as an elastic solid (e.g., Bourbié 150 et al., 1987; He et al., 2022). For seismic frequencies, it is safe to neglect inertial 151 terms in the numerical upscaling procedure (e.g., Rubino et al., 2013). Hence, the 152 poroelastic equations of motion (Biot, 1956a,b) reduce to the so-called consolidation 153 equations (Biot, 1941), which, in the so-called  $\boldsymbol{u} - p$  form and in the space-frequency 154 domain are given by 155

$$\nabla \cdot \boldsymbol{\sigma} = 0, \tag{1}$$

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$$-j\alpha\nabla\cdot\boldsymbol{u}(\omega) - j\frac{p(\omega)}{M} + \frac{1}{\omega}\nabla\cdot\left(\frac{k}{\eta}\nabla p(\omega)\right) = 0,$$
(2)

(3)

<sup>159</sup> where  $\boldsymbol{\sigma}$  is the total stress tensor,  $\omega$  the angular frequency, j the imaginary unit,  $\boldsymbol{u}$  is <sup>160</sup> the solid displacement, p the fluid pressure,  $\eta$  the fluid viscosity,  $\kappa$  the permeability, <sup>161</sup> M the fluid storage coefficient, and  $\alpha$  the Biot-Willis parameter. The total stress <sup>162</sup> tensor  $\boldsymbol{\sigma}$  is a function of the strain  $\boldsymbol{\epsilon}$  and of the fluid pressure p and can be written <sup>163</sup> as

$$oldsymbol{\sigma} = 2\muoldsymbol{\epsilon}(oldsymbol{u}) + \lambda_c ext{tr}(oldsymbol{\epsilon}( extbf{u}))oldsymbol{I} - lpha poldsymbol{I},$$

165 with  $\epsilon(u)$  defined as

$$\boldsymbol{\epsilon}(\boldsymbol{u}) = \frac{\nabla \boldsymbol{u} + \nabla \boldsymbol{u}^T}{2}, \qquad (4)$$

where  $\mu$  is the shear modulus of the dry frame,  $\lambda_c$  the Lamé parameter, **I** is the identity matrix, and tr() denotes the trace operator. The Biot-Willis parameter  $\alpha$ , the fluid storage coefficient M, and the Lamé parameter  $\lambda_c$  are given by

$$\alpha = 1 - \frac{K_m}{K_s},\tag{5}$$

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$$M = \left(\frac{\alpha - \phi}{K_s} + \frac{\phi}{K_f}\right)^{-1},\tag{6}$$

173 and

$$\lambda_c = K_m + \alpha^2 M - \frac{2}{3}\mu,\tag{7}$$

where  $\phi$  denotes the porosity and  $K_f$ ,  $K_m$ , and  $K_s$  are the bulk moduli of the fluid phase, the dry matrix, and the solid grains, respectively.

Due to computational constraints, we perform a 2D analysis under the hypothesis of plane strain conditions (Rubino et al., 2016). As previously stated, in order to obtain the effective stiffness matrix of the considered medium, we apply three oscillatory relaxation tests to a representative sample (Rubino et al., 2016). The first

test (Figure 1a) consists of a harmonic vertical compression, which is performed by 181 applying a time-harmonic homogeneous vertical displacement at the top boundary of 182 the representative sample, while keeping the vertical displacement null at the bottom 183 boundary. The second test (Figure 1b) is a harmonic horizontal compression test, 184 which consists of the application of a normal displacement at a lateral boundary of 185 the sample, while keeping the horizontal displacement null at the opposing bound-186 ary. The third and final test (Figure 1c) consists of the application of a harmonic 187 horizontal displacement at the top boundary of the sample, while keeping the bottom 188 boundary fixed in place. Following Favino et al. (2020), unless otherwise stated, the 189 displacements and pressures obey periodic boundary conditions. Given that the over-190 all response of a heterogeneous poroelastic medium can be effectively reproduced by 191 those of an effective homogeneous viscoelastic solid (e.g., Rubino et al., 2016; Solazzi 192 et al., 2016), the volumetric averages of stress and strain, in response to each of the 193 three tests outlined above, can be related through an effective frequency-dependent 194 and complex-valued stiffness matrix (e.g., Rubino et al., 2016) 195

$$\begin{pmatrix} \langle \sigma_{11}^{k}(\omega) \rangle \\ \langle \sigma_{22}^{k}(\omega) \rangle \\ \langle \sigma_{12}^{k}(\omega) \rangle \end{pmatrix} = \begin{pmatrix} C_{11}(\omega) & C_{12}(\omega) & C_{16}(\omega) \\ C_{12}(\omega) & C_{22}(\omega) & C_{26}(\omega) \\ C_{16}(\omega) & C_{26}(\omega) & C_{66}(\omega) \end{pmatrix} \begin{pmatrix} \langle \epsilon_{11}^{k}(\omega) \rangle \\ \langle \epsilon_{22}^{k}(\omega) \rangle \\ \langle 2\epsilon_{12}^{k}(\omega) \rangle \end{pmatrix},$$
(8)

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<sup>197</sup> where k = 1, 2, 3 refers to three oscillatory tests,  $C_{ij}(\omega)$  are the components of the <sup>198</sup> stiffness matrix in Voigt notation, and  $\langle \epsilon_{ij}^k(\omega) \rangle$  and  $\langle \sigma_{ij}^k(\omega) \rangle$  represent the volume-<sup>199</sup> averages of the strain and stress components in response to the test k, respectively. <sup>200</sup> This system of equations has nine equations and six unknowns, and the best-fitting <sup>201</sup> values of  $C_{ij}(\omega)$  are obtained by a least squares algorithm, using the averaged stress

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and strain fields obtained from the three tests for each frequency. The resulting phase
velocities are (Rubino et al., 2016):

$$V_{P,S}(\omega,\theta) = \frac{\omega}{\Re(\kappa_{P,S}(\omega,\theta))},\tag{9}$$

where  $\Re$  denotes the real part,  $\kappa_{P,S}(\omega,\theta)$  are the complex-valued wavenumbers ob-205 tained by solving the elastodynamic equation in a medium defined by the stiffness 206 matrix in Equation (8). The reader is referred to the work of Rubino et al. (2016) for 207 the detailed procedure of obtaining the coefficients of the stiffness matrix combining 208 the stress and strain measurements of the three oscillatory tests and the resulting 209 phase velocities. Further details about the corresponding numerical implementation 210 and boundary conditions can be found in Favino et al. (2020). Effective-medium-211 type scaling approaches are based on the assumption that the size of the sample 212 modelled constitutes a representative elementary volume (REV) of the probed for-213 mation. A sample corresponds to a REV, (i) when it is structurally typical of the 214 studied rock volume and (ii) when the inferred seismic properties are independent of 215 the boundary conditions applied (e.g., Milani et al., 2016; Caspari et al., 2016). When 216 considering complex fracture networks, generating samples of the medium that are 217 large enough to constitute a REV may not be feasible. To overcome this difficulty, 218 we follow the approach of Rubino et al. (2009) and Quiroga et al. (2022), who employ 219 the previously outlined upscaling approach in a Monte Carlo fashion on sub-REV-220 size samples that are within our numerical capabilities. The Monte Carlo procedure 221 consists of obtaining representative mechanical properties by averaging a sufficient 222 number of stochastic realizations of samples with the same statistical properties. In 223



Figure 1: Schematic illustration of the (a) vertical, (b) horizontal, and (c) shear numerical oscillatory relaxation tests employed to obtain the equivalent stiffness matrix of the considered sample. (d, e, f, g) Fluid pressure distributions in a subsection of the sample highlighted in (a) subjected to a vertical compression for different dispersion regimes. Increasing pressure is denoted by progressive intensities of orange. (d) fracture-to-background FPD: pressure exchange between fractures and their embedding background, (e) non-dispersive plateau: pressure is equilibrated between connected fractures; (f) fracture-to-fracture FPD: pressure exchange between connected fractures; (g) High frequency limit: pressure confined to the horizontal fracture. (h) body wave velocities as functions of frequency for samples with unconnected fractures (red line) and connected fractures (blue line). The frequency ranges where body wave dispersion due to fracture-to-background and fracture-to-fracture FPD prevails are highlighted in yellow. Typical frequency range of seismic studies is shown inside the non-dispersive plateau.

this study, we obtain P- and S-wave velocities of samples with the same degree of 224 fracture connectivity and steam saturation. The stabilization of the standard devia-225 tion of the averaged velocities as a function of the number of realizations serves as the 226 convergence criterion (Rubino et al., 2009). Once the convergence has been achieved, 227 we can consider the inferred averaged seismic velocities as being representative for 228 the considered formation as a whole. Correspondingly, we refer to these averages 229 as effective body wave velocities from now on. Appendix A provides a step-by-step 230 description of the upscaling procedure outlined above. 231

## <sup>232</sup> Fracture network properties

For the numerical analysis, we consider mesoscale fracture networks with a uniform distribution of fracture orientations and a power law distribution of fracture lengths. The latter is widely regarded as a seemingly universal and ubiquitous characteristic of fractures (e.g., de Dreuzy et al., 2001; Bonnet et al., 2001). Following previous works on this topic (e.g., Hunziker et al., 2018; Quiroga et al., 2022), we use

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$$n(L) = F_d(a-1) \frac{L^{-a}}{L_{min}^{1-a}}; L \in [L_{min}, L_{max}],$$
(10)

where L is the fracture length, n(L), is the density function quantifying the number of fractures in the considered fractured formation with a length comprised between Land L + dL, where dL denotes an infinitesimal increment of length, a is the so-called characteristic exponent of the fracture size distribution, and  $L_{min}$  and  $L_{max}$  are the bounding minimum and maximum length values, respectively. The exponent a can take values between 1.5 and 3 and controls the prevalence of shorter to longer frac-

tures within the limits given by  $L_{min}$  and  $L_{max}$ . Following Hunziker et al. (2018), 245 we choose an intermediate value of 2.25.  $F_d$  is the fracture density defined as the 246 ratio of area of the fractures and the total area of the sample. With regard to the 247 interconnectivity of fractures, we consider three scenarios: (i) a randomly connected 248 scenario, where fractures are randomly placed; (ii) a fully connected scenario, where 249 fractures are randomly placed but ensuring that all of them have at least one con-250 nection with another fracture by randomly relocating unconnected fractures; (iii) a 251 fully unconnected scenario, where fractures do not have any connections between each 252 other, a configuration that is achieved by randomly relocating connected fractures. 253

In order to simulate partial saturation of water and steam in the context of a frac-254 tured formation, we use the following saturation procedure. We start with samples 255 whose embedding background and fractures are completely saturated with water. 256 Then, we progressively increase the percentage of steam saturation in the fracture 257 pore space until all fractures are steam saturated, while the background remains sat-258 urated with water. We ignore the possibility that some regions of the embedding 259 low-porosity background may also contain steam as the corresponding mechanical 260 effects are of subordinate importance to fracture related FPD effects. Fractures are 261 always completely saturated with either water or steam. This is achieved by saturat-262 ing first the longer fractures with steam, as they tend to be associated with greater 263 permeabilities (e.g., Vermilye and Scholz, 1995). It is expected that these fractures 264 are more susceptible to pressure changes, which are a key driving mechanism for the 265 appearance of steam in our model. In this context, it is important to note that the 266

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<sup>267</sup> poroelastic properties, including the permeability, of the material filling the fractures, <sup>268</sup> are kept invariant in our model in order to minimize secondary effects and focus on <sup>269</sup> those related to changes in saturation and interconnectivity.

In order to minimize the number of samples that ensure convergence of the Monte 270 Carlo procedure, we impose certain restrictions in the fracture network creation pro-271 cess. For each realization to be averaged in the Monte Carlo procedure, we draw 272 a particular sampling of the fracture length distribution by employing the density 273 function described in Equation 10. This fracture length distribution is then used, 274 by varying fracture placement and orientations, to generate the three different con-275 nectivity scenarios explained above. These samples are initially considered to be 276 completely saturated with water and their fracture networks are then progressively 277 saturated with steam according to the procedure described above, thus, resulting in 278 samples with varying steam saturation values. In this way, each realization is com-279 posed of several samples, which share a common fracture length distribution, and, in 280 the case of samples with a same degree of connectivity, but varying steam saturation, 281 the placement and orientation of fractures is identical. This is illustrated in Figure 282 2, which illustrates that the saturation process is done on the same fracture network 283 for each connectivity scenario. For each new realization to be averaged, a new frac-284 ture length distribution is drawn, and the process is repeated until the convergence 285 criterion for each connectivity and steam saturation scenario is achieved. Like this, 286 we can assure that changes in the mechanical properties in each realization are either 287 due to changes in fracture connectivity or due to changes in saturation and, hence, 288

unrelated to other factors, which are not the objective of study of this work.

## <sup>290</sup> Fluid Pressure Diffusion Effects

In the following, we briefly outline the nature and characteristics of FPD effects in 291 fractured formations, based on recent works in the literature (e.g., Rubino et al., 292 2013, 2017; Hunziker et al., 2018; Solazzi et al., 2020). We consider samples with 293 fractures that are in the mesoscopic scale range, that is, the fractures are larger than 294 the pore scale but smaller than the dominant wavelength. For typical seismic fre-295 quencies between 5 and 60 Hz, and typical upper crustal P-wave velocities between 296 3000 and 6000 m/s, the wavelengths tend to be larger than 50 m, while the fractures 297 considered in these studies tend to be shorter than one meter. When a seismic wave 298 propagates through a fluid-saturated porous medium containing fractures in this scale 299 range, the viscous friction associated with FPD effects results in seismic energy dis-300 sipation, which manifests itself in the form of velocity dispersion and attenuation. 301 In the presence of connected fractures, two manifestations of FPD can arise (Rubino 302 et al., 2013). The large stiffness contrast between fractures and their embedding 303 background generates pressure gradients in response to the strains associated with 304 seismic wave propagation, which, in turn, generate oscillatory fluid flow between these 305 regions. This process is referred to as fracture-to-background FPD (Figure 1d). Ad-306 ditionally, fluid pressure gradients occurring within intersecting fractures undergoing 307 different levels of compression/extension due to their respective orientations with re-308 spect to the direction of seismic wave propagation result in fracture-to-fracture FPD 309



Figure 2: Examples of the fractured samples employed in the Monte Carlo procedure. Samples are 50 cm x 50 cm, the fracture area represents 1% of the total sample area, and the minimum and maximum fracture lengths are 4 and 25 cm, respectively. White-colored fractures denote brine-saturation while red-colored fractures denote saturation by steam. The top row represents totally unconnected fracture networks, the middle row totally connected fracture networks, and the bottom row randomly connected fracture networks. Steam saturation increases from left to right.

(Figure 1f). If the intersecting fractures contain fluids with differing compressibil-310 ities, such as liquid and gas, fracture-to-background FPD effects are diminished in 311 comparison to fully water-saturated fractures (e.g., Kong et al., 2013; Solazzi et al., 312 2020). This is due to the fact that the lower compressibility of gas allows for a lower 313 overall equilibrium pressure within the fractures, thus, reducing the pressure gradient 314 between the fractures and the background and, hence, resulting in smaller fracture-to 315 background FPD. The presence of varying fracture saturation also affects fracture-316 to-fracture FPD, but, in this case, the orientation of the fractures with regard to 317 the incident P- or S-waves affects the outcome (Solazzi et al., 2020). Depending on 318 whether the liquid or the gas are compressed by the seismic waves, FPD effects are 319 either enhanced or diminished. If the liquid phase is preferentially compressed, the 320 more compliant gas allows for a larger amount of liquid to flow into the connected gas-321 saturated fractures as compared to the scenario of both fractures being saturated with 322 liquid. This increase in fluid flow translates into stronger FPD effects. Conversely, 323 when the more compliant gaseous phase is preferentially compressed, the increase in 324 pressure is less pronounced, which, in turn, does not favor FPD between connected 325 fractures. 326

When looking at the associated frequency ranges, fracture-to-background FPD tends to occur at lower frequencies than fracture-to-fracture FPD, because the characteristic frequencies of these FPD manifestations are proportional to the permeability of the regions experiencing fluid flow. Given that the permeability of the embedding background is inherently much smaller than that of the fractures, fracture-to-

background FPD occurs over a longer timescale and, thus, prevails at lower frequen-332 cies than fracture-to-fracture FPD. Above the frequency range, at which fracture-333 to-background FPD prevails, the sample behaves as if the fractures were hydrauli-334 cally isolated from the background. The frequency range between the fracture-to-335 background and fracture-to-fracture FPD regimes is characterized by pressure equi-336 librium within connected fractures, which substantially reduces the stiffening effect 337 of the fracture fluid compared to the high-frequency limit (Rubino et al., 2017). Cor-338 respondingly, this frequency range presents little to no velocity dispersion, and is 339 hereafter denoted as the "non-dispersive plateau" (Figure 1e), in which the medium 340 essentially behaves elastically. It is worth noting that, in the presence of two fluid 341 phases, the frequency range, at which fracture-to-fracture FPD prevails, can be wider 342 than in the case of single-phase saturation (Solazzi et al., 2020). For frequencies 343 higher than those, at which fracture-to-fracture FPD prevails, the sample behaves 344 as if fractures were hydraulically isolated from the background and from each other, 345 as there is not enough time during a half wave cycle for pressure diffusion to occur. 346 This is the so-called no-flow or high-frequency limit (Figure 1g), beyond which the 347 medium essentially behaves elastically. 348

It is important to remark here that although there is neither attenuation nor velocity dispersion in the frequency range covered by the non-dispersive plateau, seismic velocities are inherently lower than those associated with the high-frequency elastic limit (Figure 1h). This means that, even though the body wave velocities in the non-dispersive plateau are representative of a non-dispersive, elastic medium,

they can only be adequately modelled by accounting for the prevailing FPD effects.

## RESULTS

## <sup>355</sup> Seismic response of partially saturated fractured granite

In order to obtain the mechanical response of a fractured granite, which is a typical 356 environment hosting high-enthalpy geothermal reservoirs, we employ the physical 357 properties listed in Table 1. The rock physical properties of granite correspond to 358 those listed in Detournay and Cheng (1993). We model the fractures as very soft, 359 porous and permeable inclusions whose grain level properties correspond to those 360 of the embedding granitic background. Fractures have fixed properties regardless of 361 their length, which were adapted from Rubino et al. (2017). The permeability of 362 the fractures is 9 orders-of-magnitude higher than that of the background, and the 363 resulting normal and shear compliances of the fractures are consistent with recent field 364 measurements (e.g., Barbosa et al., 2019). We consider water as the main saturating 365 fluid and steam as the secondary fluid. The properties of water and steam are a 366 matter of study in several works, as the interactions between the two phases can be 367 complex (e.g., Grab et al., 2017). For simplicity, we consider water and steam to 368 be separated phases that do not interact with each other in terms of mixing or heat 369 transfer during the passage of seismic waves. This first-order approximation results 370 in the maximum difference between the module of the gaseous and liquid phases, 371 which, in turn, implies that our results represent a best-case scenario with regard to 372

Rock	Granite Background	Fractures	
Solid grain density $(\rho^S)$	$2700~\rm kg/m^3$	$2700~\rm kg/m^3$	
Solid grain bulk modulus $(K^S)$	45 GPa	45 GPa	
Dry frame shear modulus( $\mu^d$ )	19 GPa	0.02 GPa	
Dry frame bulk modulus $(K^d)$	35 GPa	0.04 GPa	
Permeability	$1e-19 m^2$	$1e-10 \text{ m}^2$	
Porosity $(\phi)$	0.02	0.8	
Fluid	Brine	Steam	
Fluid viscosity $(\eta)$	$6.6e{-5}$ Pa.s	2.38e-5 Pa.s	
Fluid bulk modulus $(K^f)$	0.191 GPa	0.0229 GPa	
Fluid density $(\rho^f)$	$574 \text{ kg/m}^3$	$113 \ \mathrm{kg/m^3}$	

Table 1: Properties of intact granitic background and embedded fractures. Granite properties were taken from Detournay and Cheng (1993). Fractures are represented as highly compliant, porous, and permeable inclusions, whose grain-level properties correspond to those of the embedding background (Rubino et al., 2017). Fluid properties correspond to a temperature of 350 degrees Celsius and a pressure of 167 bar for brine, and the same temperature and a pressure of 165 bar for steam. These properties are obtained from the XSTEAM matlab routine (Holmgren, 2006).

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the sensitivity of seismic methods to the presence of steam. The properties of the 373 fluids are obtained from the XSTEAM Matlab subroutine (Holmgren, 2006) following 374 the standards of the International Association of the Properties of Water and Steam 375 (IAPWS). In our model, we consider a fixed temperature of 350 °C and a pressure 376 of approximately 167 bar for the liquid water phase. The latter corresponds to the 377 saturation pressure of liquid water for that temperature. For the fractures containing 378 steam, we consider a pore fluid pressure of 165 bar, which allows for the existence of 379 such gaseous phase. We assume that such decrement of pressure does not affect any 380 other properties of the fractured rock. 381

We employ the upscaling procedure described in the Methodology section on square samples with a side length of 50 cm, with rectangular fractures corresponding to a fracture density Fd = 1%, as schematically illustrated in 2. We consider fractures with a stochastic distribution of fracture lengths with an  $L_{max} = 25$  cm;  $L_{min} = 4$  cm, and a fixed aperture of 0.4 mm. These values correspond to aspect ratios between 625 and 100, which are consistent with values observed in nature (e.g., Vermilye and Scholz, 1995). We define the fracture steam saturation  $S_s^f$  as

$$S_s^f = 100 * V_s^f / V_n^f [\%], \tag{11}$$

where  $V_p^f$  is the total pore volume of the fractures and  $V_s^f$  is the fracture pore volume saturated with steam. We compute velocities for  $S_s^f$ -values of 0, 10, 25, 50, 75 and 100%. For this, we generate 50 realizations for each of the three fracture connectivity degrees described earlier and for each fracture steam saturation modelled. As illustrated in Appendix B, we found that this number of realizations is sufficient



Figure 3: (a, b, c) P- and (d, e, f) S-wave velocities as functions of frequency for a single realization of connected (dotted lines) and unconnected (dashed lines) fracture networks. Steam saturation of the fractures  $S_s^f$  is (a, d) 0%, (b, e) 50% and (c, f) 100%.

for stabilizing the standard deviations of the velocity in the non-dispersive plateau, 395 which is the convergence criterion of the employed Monte Carlo approach (Rubino 396 et al., 2009). It is important to mention that, for representative effective velocities 397 and an a upper frequency limit of 60 Hz, the ratio of wavelength to fracture length 398 is at least 40 for P-waves and 25 for S-waves. This is consistent with the assump-399 tion of mesoscale fractures in our upscaling procedure. Figure 3 shows the P- and 400 S-wave velocities as functions of frequency for single samples, that is, for individual 401 fracture networks of the ensembles used to get averaged representative values for the 402

non-dispersive plateau. Even though such realizations do not constitute representa-403 tive samples, the results shown in Figure 3 allow to illustrate the effects of FPD on 404 the body wave velocities of the samples. Velocity values are shown for the connected 405 (dotted lines) and unconnected (dashed lines) cases as well as for different levels of 406 steam saturation of the fractures. Two manifestations of velocity dispersion can be 407 discerned, one around  $10^{-2}$  Hz corresponding to fracture-to-background FPD and the 408 other around  $10^{6}$  Hz corresponding to fracture-to-fracture FPD. The non-dispersive 409 plateau is located between these two distinct FPD manifestations, where increasing 410 levels of fracture connectivity are associated with significantly lower P- and S-wave 411 velocities. Please note that the non-dispersive plateau includes the typical frequen-412 cies of active and passive seismic exploration and monitoring methods (approximately 413 0.1 Hz to 60 Hz). In this frequency range, there is not enough time in a half wave 414 cycle to allow for pressure diffusion between the fractures and background. This 415 means that, in the case of isolated fractures, the fluid contained inside the fractures 416 has a significant stiffening effect in response to compressional forces. For the case of 417 connected fractures, however, there is enough time to allow pressure to equilibrate 418 between connected fractures, thus, greatly diminishing the fluid stiffening effect and, 419 correspondingly, lowering the velocities of the formation. These mechanisms explains 420 the lower velocity values for connected fracture networks in comparison to uncon-421 nected fracture networks for seismic frequencies, regardless of the saturation state in 422 the fractures. 423

424

Again, focusing on the frequencies comprised by the non-dispersive plateau, let

us now analyze the effects that partial steam saturation of the fractures has on the 425 body wave velocities of the formation. We observe different behaviors for P- and 426 S-wave velocities and for different connectivities of the fracture network. For P-427 wave velocities the marked velocity drop associated with increasing  $S_s^f$  is particularly 428 important, indicating that P-wave velocities are adequate to detect and monitor the 429 initial appearance of steam (Figures 3a, 3b, and 3c). In the case of S-wave velocities, 430 we observe that the velocity drops associated with different levels of steam saturation 431 are much less pronounced than for P-waves (Figures 3d, 3e, and 3f). These are 432 interesting results, as Solazzi et al. (2020) reports significant effects for both P- and 433 S-waves in a context of partial saturation of fractures with brine and  $CO_2$ . Notably, 434 the S-wave velocities drop due to changes in fluid content are comparable to possible 435 changes in connectivity for a fully water-saturated fracture network. In the case of 436 P-wave velocities, on the other hand, changes associated with fluid content are much 437 larger than those associated with changes in connectivity for a fully water-saturated 438 fracture network. 439

When looking at values in the high-frequency limit, we observe that the differences between connected and unconnected cases are much narrower than those corresponding to the non-dispersive plateau. These values correspond to a high-frequency elastic representation that does not consider hydraulic communication between connected fractures. In the following, we analyze the results obtained from the Monte-Carlotype procedure described in the Methodology section for velocities corresponding to (i) the non-dispersive plateau and to (ii) the high-frequency limit of the medium.

Figure 4 shows the effective body wave velocities as functions of the steam saturation for different fracture connectivities and different frequency regimes, obtained by means of the Monte Carlo approach. The frequency regimes correspond to (i) the non-dispersive plateau (employing the velocity values for 10 Hz), in the following denominated as the *poroelastic approach*, and to (ii) the high-frequency elastic behavior of the formation, which we also refer to as *elastic*, as it corresponds to the response of an elastic background that contains elastic fractures (inclusions).

Figures 4a, 4b, and 4c show  $V_P$  as function of  $S_s^f$  for fully connected, randomly 454 connected, and unconnected fracture networks, respectively, for both poroelastic (red 455 lines) and elastic (blue lines) approaches. We observe that, in all cases,  $V_P$  decreases 456 with increasing steam saturation in a similar way for the poroelastic and elastic mod-457 els. The velocity values associated with these two cases, however, differ significantly 458 when FPD within connected fractures is present. This is to be expected as these mod-459 elling approaches differ significantly when fracture connectivity is present, whereas in 460 the unconnected case the responses are quite similar. We also observe that changes 461 in  $V_P$  are more pronounced for values of  $S_s^f$  below 50%. For S-waves (Figures 4d, 462 4e, and 4f), we observe that, as in the case of  $V_P$ , while there are significant changes 463 between the poroelastic and elastic responses randomly or fully connected networks, 464 they are quite similar for the unconnected case. Moreover, we see that in the fully 465 connected or randomly connected cases, the S-wave velocity turns out to be virtually 466 insensitive to steam saturation when FPD effects are accounted for. This, in contrast 467 with the P-wave velocity, indicates that FPD effects have a comparatively more sig-468



Figure 4: (a, b, c) P- and (d, e, f) S-wave velocities as functions of steam saturation  $S_s^f$  for different fracture connectivity scenarios. Blue lines correspond to the elastic high-frequency limit and red lines to seismic frequencies within the non-dispersive plateau. The relative velocity change for each connectivity level (g, h, i) is computed as  $\Delta V = \frac{V_{P,S}(S_s^f) - V_{P,S}(S_s^f=0)}{V_{P,S}(S_s^f=0)}$ , and is shown for  $V_P$  (continuous lines) and  $V_S$  (dashed lines).

#### Seismic signatures of steam

nificant impact for S-waves. We remark that fully unconnected fracture networks for
a fracture density such as the one we consider here are unlikely in nature, and that
this end-member-type scenario is shown for comparison purposes.

As previously stated, velocity changes associated with  $S_s^f$  are shown in more detail 472 in Figures 4g, 4h, and 4i, which depict the relative changes with respect to  $S_s^f = 0$ . We 473 can observe that the resulting relative differences for the unconnected case are similar 474 for the poroelastic and the elastic approaches. However, in the case of fully connected 475 (Figure 4g) and randomly connected (Figure 4h) fracture networks, there are clear 476 differences between these models. These differences are particularly significant when 477 considering S-wave velocities, where the poroelastic approach presents practically no 478 changes with respect to  $S_s^f$  (red dashed lines), while the elastic model shows much 479 higher relative changes (blue dashed lines). This result shows that employing classic 480 elastic approaches may lead to an overestimation of the sensitivity of S-wave velocities 481 to changes in saturation in fractured media. It is worth noting that, while S-wave 482 velocities appear to be insensitive to changes in saturation in fractured media for 483 the fully connected and randomly connected cases, previous research shows that they 484 are sensitive to changes in fracture density in a geothermal reservoir context (e.g., 485 Quiroga et al., 2022). 486

Given that changes of both fracture density and steam saturation can result from pressure fluctuations in geothermal reservoirs, let us analyze the sensitivity of P- and S-wave velocities to both parameters. For this, we use data from Quiroga et al. (2022) where the sensitivity of P- and S-wave velocity to changes in fracture density was

Formation	Fd	$V_P  [{\rm m/s}]$	$V_S  [{\rm m/s}]$	$\rho_b \; [\rm kg/m^3]$
	0.25%	4687	2428	2694
Fractured	0.35%	4609	2321	2692
Granite	0.50%	4510	2186	2690
	0.60%	4451	2088	2688
	0.75%	4330	1929	2687
	0.90%	4270	1825	2683

Table 2: Mechanical properties of fractured granite with variable fracture densities. These characteristics correspond to randomly connected fractured granite saturated with brine ( $K_f = 2250GPa, \eta = 1e^{-3}Pa.s$ ) for different Fd values. These values correspond to frequencies in the non-dispersive plateau. Taken from Quiroga et al. (2022).

<sup>491</sup> analyzed. The upscaling procedure and the properties of the embedding background <sup>492</sup> and the fractures are identical to the ones of this work. The key difference is that <sup>493</sup> in Quiroga et al. (2022) both fractures and background are saturated with brine <sup>494</sup> ( $K_f = 2250$  GPa,  $\eta = 1e^{-3}$  Pa.s). The effective velocities are listed in Table 2 <sup>495</sup> and correspond to randomly connected fracture networks with fracture density *Fd* <sup>496</sup> percentages of 0.25, 0.35, 0.50, 0.60, 0.75, and 0.90.

In order to compare the effects of steam variation considered here and the effects of fracture density in brine-saturated media explored by Quiroga et al. (2022), the plotted P-velocity values of both studies are scaled by their respective maximum val-



Figure 5: (a) Crossplot of  $V_P/V_S$  against  $V_P$ . Orange dots correspond to randomly connected fracture networks with a fixed fracture density Fd of 1% and varying  $S_s^f$ , from 0 to 100%. Blue dots were taken from Quiroga et al. (2022) and correspond to fracture networks with identical fracture properties, varying fracture density from 0.25% to 0.9% and water ( $K_f = 2250$  GPa,  $\eta = 1e^{-3}$  Pa.s) as the saturating fluid.  $V_P$  values are normalized with respect to the respective maximum values for ease of comparison.  $V_P$ -values for variable fracture density are divided by the value of  $V_P$  for Fd = 0.25% and the  $V_P$ -values for variable fracture steam saturation by the value of  $V_P$  for  $S_s^f = 0\%$ . (b)  $V_P/V_S$  ratio as a function of Fd for fracture networks with full water saturation. (c)  $V_P/V_S$  ratio as a function of  $S_s^f$  for fracture networks with fracture density  $F_d = 1\%$ .

ues in Figure 5a. The highest P-wave velocity values occur for  $S_s^f = 0\%$  in our current 500 study and for a fracture density Fd = 0.25% for the study performed in Quiroga et al. 501 (2022). Both increments in  $S_s^f$  and Fd are associated with similar relative decrements 502 in P-wave velocity, therefore, it would not be possible to distinguish steam variations 503 from fracture density changes using this parameter alone. However, the behavior of 504 S-wave velocities allows us to distinguish between these characteristics. As shown in 505 Figure 5b, increments of fracture density are associated with increases in the  $V_P/V_S$ 506 ratio. Conversely, increasing presence of steam in the fractures is associated with 507 decrements in the corresponding  $V_P/V_S$  ratio (Figure 5c). This result shows that 508 there is a possibility for certain techniques, or combinations thereof, to identify the 509 causes behind commonly observed velocity drops in geothermal monitoring surveys 510 (e.g., Taira et al., 2018; Obermann et al., 2015). 511

## <sup>512</sup> Impact of partial saturation on seismic monitoring techniques

Let us now explore the impact of the presence of steam on seismic monitoring methods. For this, we consider the canonical model of a high-enthalpy geothermal reservoir as depicted in Figure 6. We assume that the reservoir has a temperature of  $350^{\circ}$ C. In order to be close to the saturation pressure of liquid water, which, for this temperature, is approximately  $1.67 \times 10^7$  Pa or 167 bar. Considering a normal lithostatic pressure gradient (e.g., Tiab and Donaldson, 2015), this corresponds to a depth of approximately 700 m.

<sup>520</sup> The physical properties of the geological model employed are described in Table

Formation	Lithology	Depth	$S^f_s$	$V_P  [{\rm m/s}]$	$V_S  [{\rm m/s}]$	$\rho_b \; [\rm kg/m^3]$
Overburden	Sandstone	0-600 m	-	3000	1600	2500
			0%	3186	1680	2684
	Partially		10%	3025	1675	2683
Upper	saturated	600-800 m	25%	2902	1667	2683
reservoir	fractured		50%	2789	1656	2682
	granite		75%	2715	1646	2681
			100%	2668	1637	2681
Lower reservoir	Fractured granite	800-1000 m	0%	3186	1680	2684
Basement	Intact granite	1000-∞ m	-	4810	2620	2700

Table 3: Properties of the geological model

Quiroga et. al.

3. This model consists of a surficial layer of homogeneous sandstone to 600 m depth, 521 below which the reservoir formation is located. This layer consists of 400 m of frac-522 tured granite, which we consider to be divided in two different sections. The upper 523 section of the reservoir is located at depths between 600 m and 800 m, and can have 524 either steam or water in its fractures. The lower section of the reservoir is located 525 between 800 m and 1000 m depth, and it is saturated exclusively with water, as, 526 at these depths the higher lithostatic pressure does not allow for the occurrence of 527 steam. Below the reservoir formation, there is a semi-infinite layer of intact granite, 528 with the same petrophysical properties as the background reservoir rock (Table 1). 529 The sandstone layer and the intact granite basement are considered homogeneous and 530 elastic, and, hence, seismic waves traversing them are not attenuated or dispersed. 531 Conversely, the seismic velocities for the upper and lower reservoir are those obtained 532 from the upscaling procedure (Figure 4). We consider for the upper reservoir differ-533 ent values of  $S_s^f$ , while the lower reservoir is fully saturated with water. We employ 534 the velocity values corresponding to randomly connected fracture networks, as it is 535 the case that can be considered as more realistic compared to the end-member type 536 scenarios of completely unconnected or completely connected fracture networks ex-537 plored in the previous section. In the following, we utilize this model to simulate 538 results related to Rayleigh wave monitoring and reflection seismic surveys. 539

#### 540 Rayleigh wave dispersion modelling

To compute Rayleigh wave velocity dispersion, we employ the so-called fast delta 541 matrix algorithm (Buchen and Ben-Hador, 1996). This algorithm considers homo-542 geneous horizontal layers with no velocity dispersion. Although we are employing 543 a poroelastic upscaling procedure that accounts for velocity dispersion due to FPD, 544 for the frequencies of interest for this analysis ( $\sim 0.1$  Hz to  $\sim 3$  Hz) fall into the 545 non-dispersive plateau and the corresponding velocities, thus, present negligible ve-546 locity dispersion (Figure 3). As absolute differences between Rayleigh wave disper-547 sion curves might be difficult to discern, we compute relative velocity differences as 548  $\Delta V_{p,g}(S_s^f) = max_{freq}(\frac{V_{p,g}(S_s^f) - V_{p,g}(0)}{V_{p,g}(0)})$ , that is,  $\Delta V_{p,g}$  is the relative velocity difference 549 for the frequency where it attains its maximum value,  $V_{p,g}(S_s^f)$  is the frequency-550 dependent Rayleigh wave velocity for a given  $S_s^f$  and  $V_{p,g}(0)$  is the Rayleigh wave 551 velocity for  $S_s^f = 0$ . The subindexes p, g denote phase and group velocities, respec-552 tively. To model the sensitivity of Rayleigh wave based methods to different fracture 553 steam saturation, we consider different values of  $S_s^f$  in the upper part of the reservoir. 554 The results of the Rayleigh wave phase and group velocity, as well as the associated 555 relative velocity differences for different  $S_s^f$  values, are shown in Figure 7. 556

Figures 7a and 7b show the Rayleigh wave phase and group velocity dispersion considering the poroelastic and elastic approaches, respectively. For both phase and group velocities and for both approaches, we observe higher velocities for low frequencies, due to the fact that Rayleigh waves penetrate deeper due to the correspondingly longer wavelengths. This corresponds to the stiffer intact granitic basement in our



Figure 6: Schematic representation of the geothermal reservoir model employed in the analysis. The sandstone and intact granitic layers are considered to be homogeneous, while the granitic reservoir is characterized as a fractured formation with the fractures being saturated with either water and steam (upper part of the reservoir) and only water (lower part of the reservoir).



Figure 7: (a, b) Phase and group velocity dispersion of Rayleigh waves for the model described in Table 3 for different levels of steam saturation in the upper part of the reservoir, considering (a) a poroelastic and (b) an elastic approach. Relative velocity difference  $(\Delta V_p, g(S_s^f))$  for phase (solid lines) and group velocities (dashed lines) for (c) poroelastic and (d) elastic approaches. Relative velocity differences are computed as the maximum difference between the dispersion at a certain steam saturation and the dispersion corresponding to a steam saturation of 0% divided by the value of the latter.

model. In addition, the velocities decrease as the frequency increases, and we can 562 observe that the frequencies where variations of  $S_s^f$  have an impact on the Rayleigh 563 wave measurements are comprised between 0.2 Hz and 1.5 Hz. It is also worth noting 564 that there is a discrepancy between the modelled impact of steam saturation using 565 a poroelastic approach and an elastic approach. This discrepancy may lead to an 566 overestimation of the ability of Rayleigh-wave-based techniques to detect the pres-567 ence of steam in geothermal reservoirs. Figures 7c and 7d show the relative difference 568 between varying degrees of steam saturation in the upper reservoir and the case of an 569 upper reservoir without the presence of any steam. As the impact of partial satura-570 tion on S-waves is limited when FPD are taken into account, we observe that, in this 571 case, the relative velocity changes in Rayleigh wave velocity dispersion amount to a 572 maximum of  $\sim 3\%$  for the case of Rayleigh group velocities and less than 2% when 573 steam saturation goes from 0% to 100%. We observe that the relative changes for the 574 elastic approach are almost double those of the models considering FPD effects. 575

It is interesting to compare the corresponding impact of varying  $S_s^f$  or fracture 576 density Fd. As shown in Figure 5, changes of Fd from 0.25 % to 0.90% produce 577 relative variations of P-wave velocity similar to those produced by changes in  $S_s^f$  for 578 the properties considered in this work. To explore the sensitivity of Rayleigh wave 579 velocity dispersion to changes in Fd we consider the reservoir's properties listed in Ta-580 ble 2. We consider the extreme case of a lower reservoir composed of brine-saturated 581 granite with a Fd of 0.25% and fully brine-saturated upper reservoir, with varying 582 Fd. Based on this model, the maximal variation of Rayleigh wave velocities occurs 583

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when the upper reservoir changes its density from 0.25% to 0.90%, in which case the 584 relative change in velocities is  $\Delta V_{p,g}(0.90\%) = max_{freq}(\frac{V_{p,g}(0.90\%) - V_{p,g}(0.25\%)}{V_{p,g}(0.25\%)})$ . In this 585 case  $V_{p,q}(0.90\%)$  and  $V_{p,q}(0.25\%)$  correspond to the Rayleigh wave phase and group 586 velocities for the corresponding values of Fd in the upper reservoir.  $\Delta V_{p,g}(0.90\%)$ 587 amounts to 17% and 7% for Rayleigh wave group and phase velocities, respectively. 588 These results, compared to the values of 3% and 2% corresponding to the most 589 extreme changes in steam saturation, show that Rayleigh wave monitoring is con-590 siderably more sensitive to changes in mechanical properties due to fracture density 591 increments than to changes in the fluid content of the fractures, as the former have a 592 more pronounced relative impact on the S-wave velocity. 593

#### 594 AVA modelling

Given that, as previously shown, the impact of partial saturation is most important 595 with regard to the P-wave velocity, reflection seismic methods are expected to be more 596 sensitive than surface-wave-based techniques to variations in the fluid content of a 597 fractured reservoir. To assess this hypothesis, we again employ the geological model 598 defined by Table 3 to compute its amplitude-versus-angle (AVA) seismic response. 599 The AVA response of an interface is affected by changes in P- and S-wave velocities, 600 and, considering the body wave velocity results previously shown, we may expect to 601 obtain information about the fluid content of the formation. For this, we consider 602 the target of the AVA inversion to be the intra-reservoir interface located at 800 m 603 between the upper part of the reservoir with the presence of steam in its fractures and 604

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the lower part of the reservoir that is completely saturated by water (Table 3). This will provide insights on whether or not reflection seismics can, in principle, identify the lower limit of steam caps in geothermal reservoirs.

Considering that for typical surface-based seismic reflection analyses, the thick-608 nesses of the layers involved in the considered geological model are larger than the 609 predominant seismic wavelengths, the AVA response at the target interface can be 610 modelled using Zoeppritz's equations (e.g., Dvorkin et al., 2014). These equations ex-611 actly model the reflection coefficients as a function of incidence angle at an interface 612 between two homogeneous elastic solids. As the frequencies of interest of reflection 613 seismics (approximately from 20 to 60 Hz) fall into the non-dispersive plateau for 614 our study, the lower and upper parts of the reservoir behave as elastic solids, and 615 Zoeppritz's equations can indeed be employed. We employ the implementation of 616 Zoeppritz equations by Hall (2015) to compute the P-wave reflection coefficient of 617 the intra-reservoir interface for different values of  $S_s^f$  for the upper part while the 618 lower part is fully saturated with water. Figure 8a shows the P-wave reflection coeffi-619 cient of the intra-reservoir interface as a function of incidence angle. Different colors 620 correspond to different percentages of fractures saturated by steam in the upper part 621 of the reservoir. Solid lines correspond to the poroelastic approach for modelling the 622 response of the reservoir and dashed lines to the elastic approach. It is worth noting 623 that the AVA response of the formation in both cases does not present significant 624 variations for low angles. 625

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In practice, AVA analysis consists of extracting the properties of the subsurface

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from the inversion of observed reflection coefficients. To do so, it is common practice 627 to employ a linearized approximation of Zoeppritz' equations (e.g., Mavko et al., 628 1998) to retrieve impedances and velocities from reflection coefficients. We employ 629 two classic approximations due to their widespread presence in the literature and 630 considering that the information they can infer from seismic data may be different 631 due to the different assumptions employed by the respective authors (e.g., Thomas 632 et al., 2016). One of the approximations we employ is that of Fatti et al. (1994), 633 which in its two-term version approximates the P-wave reflectivity  $R_{PP}$  as function 634 of incidence angle  $\theta$  as 635

$$R_{PP}(\theta) = (1 + \tan^2 \theta) \frac{\Delta I_P}{2I_P} - 8(\frac{V_S}{V_P})^2 \sin^2 \theta \frac{\Delta I_S}{2I_S},$$
(12)

where  $\Delta I_{P,S}$  denotes the difference in P- or S-wave impedance across the interface and  $I_{P,S}$  correspond to the average of the P- and S-impedances of both sides of the interface. Although the term  $(\frac{V_S}{V_P})^2$  depends on the values to retrieve, we consider the usual approach of approximating it as 1/2 for the inversion process. The other approximation we consider is based on that of Shuey (1985) and given by (e.g., Avseth et al., 2010)

$$R_{PP}(\theta) = A + G\sin^2\theta, \tag{13}$$

where A is known as the intercept and corresponds to the P-reflectivity for a normal incidence and G as the gradient and depends on the physical properties of the medium. In the following, we refer to Equations (12) and (13) simply as Fatti's and Shuey's approximations, respectively. We follow a least squares inversion procedure (e.g., Quiroga et al., 2018) to obtain the corresponding AVA coefficients from synthetic



Figure 8: P-wave reflection coefficient and AVA coefficients for the interface between the partially steam-saturated upper part of the reservoir and the water-saturated lower part of the reservoir. (a) Reflectivity as a function of angle and  $S_s^f$  (100% red, 50% yellow, and 10% blue) for poroelastic (continuous lines) and elastic approaches (dashed lines). Results for the inversion using (b) Shuey's and (c) Fatti's approximations for incidence angles between 0° and 50°. Inversion results are shown for the poroelastic (dots) and for elastic (crosses) approaches.

<sup>649</sup> reflectivity curves obtained using Zoeppritz's equations to explore their sensitivity to
<sup>650</sup> the steam saturation levels. For simplicity, we do not consider added noise in these
<sup>651</sup> simulations.

Figure 8b shows the results of inverting for AVA intercept A and gradient G (Equation 13), while Figure 8c shows those for the inversion of Fatti's coefficients  $\Delta I_p/I_p$  and  $\Delta I_s/I_s$  (Equation 12). For these inversion results, dots represent values

obtained from the poroelastic representation and crosses those corresponding to the 655 elastic response. We observe that there is a correlation of increases of steam saturation 656 with increase of the coefficients A and G. We observe that both coefficients tend to 657 increase as the degree of steam saturation increases (Figure 8b). However, while 658 the behavior of the inversion corresponding to the poroelastic approach and that 659 corresponding to the elastic approach are similar, there is a significant difference in 660 the values of the coefficients, specially for lower values of steam saturation. This shows 661 the importance of taking into account FPD effects for the detection and monitoring of 662 steam. For the inversion based on Fatti's equation (Figure 8c) we observe that there 663 is also sensitivity to steam saturation for both coefficients. In this case, however, 664 we can see that the behavior of the poroelastic modelling differs significantly with 665 regard to that of the elastic approach, as the results corresponding to the latter 666 present positive values of  $\Delta I_s/I_s$  for fracture steam saturation below 75% which are 667 negative for the poroelastic approach. This is a very important distinction as it may 668 lead to erroneous interpretations of reflection seismic data. These results indicate, 669 in principle, that AVA analysis is appropriate for detecting the base of the steam 670 cap in fractured geothermal reservoirs. Comparisons of the poroelastic and elastic 671 approaches in Figures 8b and 8c show that there are significant differences between 672 the AVA coefficients which, thus, points to the importance of FPD effects on such 673 coefficients. 674

<sup>675</sup> Considering the results for body wave velocities shown in Figure 5, it is also inter-<sup>676</sup> esting to determine whether AVA inversion is useful to distinguish between variations



Figure 9: P-wave reflection coefficient as a function of incidence angle for the interfaces between: a partially steam-saturated upper part of the reservoir and a fully watersaturated lower part of the reservoir (solid lines); a fully water-saturated upper part of the reservoir with varying fracture density Fd over a fully water-saturated lower part of the reservoir with a Fd=0.25% (dashed lines). Results for the inversion using (b) Shuey's and (c) Fatti's approximations for incidence angles between 0 and 50°. Inversion results are shown for both variable  $S_s^f$  (dots) and the variable Fd scenarios (stars).

in steam saturation and fracture density. Employing the values for granitic rock with 677 variable fracture density (Table 2) in the geological model of Table 3, we compare the 678 results corresponding to changes in the steam saturation of the fractures and changes 679 in fracture density. For variable fracture density AVA analysis, we consider the lower 680 part of the reservoir to be composed of fractured granite with a fracture density of 681 0.25%, and the upper reservoir to have variable fracture density ranging from 0.35%682 to 0.90%. Figure 9 shows the reflectivity and the AVA inversion results for both cases 683 for velocities corresponding to the non-dispersive plateau. In Figure 9a, we see the 684 P-wave reflectivity for different values of saturation (solid lines) and different values of 685 fracture density (dashed lines). We observe that the reflectivities at  $0^{\circ}$  incidence show 686 some discrepancies, which become more significant with increasing incidence angle. 687 This translates into a good separation in the crossplots of A vs G for Shuey's approx-688 imation (Figure 9b) and of  $\Delta I_P/I_P$  vs  $\Delta I_S/I_S$  for Fatti's approximation (Figure 9c). 689 These results indicate that AVA crossplot analysis could be suitable for distinguishing 690 between increases in fracture density and changes in fluid saturation. 691

## DISCUSSION

In this work, we employed a numerical upscaling procedure in order to obtain effective seismic body wave velocities of granitic rocks containing mesoscopic fractures saturated with water or steam. In this context, it is important to note that the mesoscopic assumption allows us to study FPD effects by means of a numerical upscaling approach based on concepts of effective medium theory. However, the hyperbolic

characteristics of fracture length distributions in nature implies that some fracture 697 lengths will clearly exceed the considered mesoscale range. It is, in principle, possible 698 to include mesoscopic fractures along with larger scale fractures whose length is com-699 parable to the prevailing wavelengths in the seismic analysis and, thus, to account for 700 both FPD and scattering effects. For this, one could perform wave propagation exper-701 iments using the effective properties derived in this work as those of the background 702 while the larger-scale fractures would be represented by means of discrete fracture 703 network (DFN) approaches (e.g., Lei and Sornette, 2021). An inherent limitation 704 of this approach would be, however, that hydromechanical interaction between the 705 mesoscopic and larger-scale fractures can not be considered. 706

As previously mentioned, when modelling partially saturated fracture networks, 707 we consider fractures whose lengths obey a realistic power law distribution. However, 708 we also apply some simplifications, both with regard to the mechanical and geomet-709 rical properties of the fractures as well in the way we saturate fractures. While we 710 consider varying fracture lengths, we do not consider changes in the fractures' me-711 chanical properties. This is an interesting and important topic for future research. We 712 also consider fractures that have a rectangular shape and constant apertures, while 713 in nature fractures present a wide range of complex geometries. Shape variations are 714 expected to affect the mechanical properties of the fractures, for example, in the the 715 presence of curved fracture surfaces, FPD manifestations may arise even when the 716 fractures are isolated (Lissa et al., 2021). This is a vast field of research in its own 717 and, hence, clearly exceeds the scope of this work, which focuses on first-order effects 718

of partial steam saturation. Regarding our saturation approach, our main assump-719 tions are that the background remains saturated with water at all times and that 720 fractures are saturated completely with either steam or with water. Regarding the 721 former, the embedding background rock is much more stiff than the fractures, and 722 also considering that for seismic frequencies the background behaves as hydraulically 723 isolated from the fractures, the potential presence of steam in the background would 724 have a negligible effect in terms of the mechanical response of the medium. For the 725 latter, if fractures were simultaneously saturated with both steam and water, this 726 would, provided these fluids behave as immiscible, result in additional internal FPD 727 effects within fractures (e.g., Solazzi et al., 2021). Recall that the distribution of fluids 728 within individual fractures is governed by (i) the fracture properties, such as local 729 variations in aperture (e.g., Hu et al., 2019) and (ii) the flow history (e.g., Chen et al., 730 2017). These effects are likely to be of subordinate importance in the given context. 731 It is also important to note that, if fractures are simultaneously saturated by both 732 water and steam, the assumption that these phases behave as immiscible may not 733 be adequate, as thermodynamic fluid interactions could become important. In such 734 a scenario, a model considering effective fluid properties might indeed be preferable 735 (Grab et al., 2017). 736

When computing AVA reflectivities, we assume a sharp separation between the upper part of the reservoir, which is partially saturated with steam, and the lower part of the reservoir, which is fully saturated with water. In reality, the transition from full steam to full water saturation is likely to be progressive, which would compromise the

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sensitivity of AVA methods to detect the lower limit of the steam cap. Furthermore, 741 while AVA inversion shows promise, there are situations for which it is not possible 742 to determine the second term of the governing equations in an inversion, for example, 743 when for logistical reasons, the offset range of seismic surveys is limited. In such 744 situations, reflectivity measurements are still able to detect changes in the properties 745 of the reservoir due to presence of steam, but it is not possible to differentiate the 746 effects of increasing steam saturation to those related to increases of the density or 747 connectivity of the fractures. Finally, as shown in the Results section, Rayleigh-748 wave-based methods are less sensitive to changes in the fluid content of the rock, 749 but they are quite sensitive to changes in fracture density (Quiroga et al., 2022). It 750 is, therefore, conceivable to employ Rayleigh wave inversion to complement P-wave 751 impedance measurements, as both techniques are sensitive to changes in fracture 752 density, while they respond very differently to changes in the fluid content of the 753 reservoir. 754

## CONCLUSIONS

In this work, we have analyzed the seismic response of a fractured granite formation with varying levels of steam saturation and different levels of fracture connectivity. We employed a poroelastic upscaling approach in a Monte Carlo fashion in order to obtain effective body wave velocities. The analysis of the effective body wave velocities of realistic samples reveal that partial steam saturation significantly affects the P-wave velocity while it does not have a significant impact on the S-wave veloc-

ity. These particularities are due to FPD effects and are not adequately modelled by 761 an elastic approach. A comparison with previous works that investigate changes in 762 fracture density and connectivity as driving causes for velocity drops observed dur-763 ing seismic monitoring of geothermal scenarios indicates that the effects of increasing 764 steam saturation and fracture density can be differentiated through an analysis of 765 the  $V_P/V_S$  ratio. To further develop this analysis, we incorporate these velocities in 766 a geological model compatible with the presence of hot water and steam to assess 767 the sensitivity of different characterization and monitoring techniques. We find that: 768 (i) Rayleigh-wave-based techniques are much less sensitive to changes in fluid satu-769 ration compared to changes in fracture density, and that employing a purely elastic 770 characterization may lead to an overestimation of the sensitivity of this method to 771 such changes; (ii) AVA attributes are robust in characterizing discontinuities in fluid 772 content but correct modelling of effects of FPD on the seismic velocities is required in 773 order to improve the interpretation of the data, especially when the range of incidence 774 angles is limited; and (iii) in zones where AVA characterization is not possible. P-wave 775 velocity or P-impedance estimates could be potentially combined with Rayleigh wave 776 monitoring in order discriminate between changes in steam saturation and fracture 777 density. 778

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<sup>785</sup> work.

786

## APPENDIX A

## POROELASTIC CHARACTERIZATION WORKFLOW

In the following, we summarize the steps required for the evaluation of effective seismic 787 body wave velocity and attenuation characteristics of a formation. This approach 788 is based on the theory of poroelasticity of Biot (1956a,b) and takes into account 789 FPD effects. The underlying assumptions are that the heterogeneities in the probed 790 formation are in the mesoscale range, that is, much larger than the pore scale but much 791 smaller than the prevailing seismic wavelengths, and that the frequencies analyzed 792 are sufficiently low to be able to ignore Biot's intrinsic attenuation effects. For upper 793 crustal rocks with fractures below a meter in length and typical seismic frequencies 794 (<60 Hz), these assumptions are safely met. 795

The workflow is then the following:

<sup>797</sup> 1. Obtain the poroelastic material properties of the rocks and fluids to be modelled.
<sup>798</sup> For the purpose of this study, the required properties and their sources are listed in
<sup>799</sup> Table 1.

2. Determine the statistical properties of the fractured formation, such as fracture

density, minimum and maximum fracture length, fracture aperture distribution, de-801 gree of fracture interconnectivity. Generate fractured rock samples with the desired 802 statistical characteristics. For this study, we employ a fixed fracture density, a power 803 law distribution of lengths, described by Equation 10 (Hunziker et al., 2018), and 804 an iterative fracture placement procedure to obtain different degrees of fracture in-805 terconnectivity. We also model different degrees of steam saturation of the fractures 806 of the samples by completely saturating individual fractures until the desired steam 807 saturation has been reached. 808

<sup>809</sup> 3. Apply the upscaling procedure described in the Methodology section and schemat-<sup>810</sup> ically outlined in Figure 1 to the rock samples to obtain the volumetric average of <sup>811</sup> stress and strain (Rubino et al., 2016; Favino et al., 2020).

4. Follow the procedures described in Rubino et al. (2016) to obtain the frequencydependent effective stiffness matrix coefficients and, thus, obtain the P- and S-wave
velocities and attenuation.

5. In order to obtain the effective seismic velocities, average the results associated with samples sharing the same statistical characteristics. In our study, we average samples that share the same fracture density, degree of interconnectivity and steam saturation percentage. The averaged values can be considered as representative of the formation of interest once the standard deviation of the resulting properties as a function of the number of samples averaged stabilizes (Rubino et al., 2009).

## APPENDIX B



Figure B-1

# STANDARD DEVIATION OF THE EFFECTIVE VELOCITIES

Figure B-1 depicts the evolution of the standard deviation of the effective velocities as a function of the number of stochastic realizations averaged for fully unconnected, fully connected, and randomly connected fracture network realizations. The stabilization of this value is indicative of the convergence of the Monte Carlo procedure (Rubino et al., 2009). In view of these results, we consider an average of 50 realizations as representative of the effective velocities of the considered fractured media.

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Schematic illustration of the (a) vertical, (b) horizontal, and (c) shear nu-1 988 merical oscillatory relaxation tests employed to obtain the equivalent stiffness matrix 989 of the considered sample. (d, e, f, g) Fluid pressure distributions in a subsection of 990 the sample highlighted in (a) subjected to a vertical compression for different disper-991 sion regimes. Increasing pressure is denoted by progressive intensities of orange. (d) 992 fracture-to-background FPD: pressure exchange between fractures and their embed-993 ding background, (e) non-dispersive plateau: pressure is equilibrated between con-994 nected fractures; (f) fracture-to-fracture FPD: pressure exchange between connected 995 fractures; (g) High frequency limit: pressure confined to the horizontal fracture. (h) 996 body wave velocities as functions of frequency for samples with unconnected fractures 997 (red line) and connected fractures (blue line). The frequency ranges where body wave 998 dispersion due to fracture-to-background and fracture-to-fracture FPD prevails are 999 highlighted in vellow. Typical frequency range of seismic studies is shown inside the 1000 non-dispersive plateau. 1001

<sup>1002</sup> 2 Examples of the fractured samples employed in the Monte Carlo procedure. <sup>1003</sup> Samples are 50 cm x 50 cm, the fracture area represents 1% of the total sample <sup>1004</sup> area, and the minimum and maximum fracture lengths are 4 and 25 cm, respectively. <sup>1005</sup> White-colored fractures denote brine-saturation while red-colored fractures denote <sup>1006</sup> saturation by steam. The top row represents totally unconnected fracture networks, <sup>1007</sup> the middle row totally connected fracture networks, and the bottom row randomly <sup>1008</sup> connected fracture networks. Steam saturation increases from left to right.

<sup>1009</sup> 3 (a, b, c) P- and (d, e, f) S-wave velocities as functions of frequency for a <sup>1010</sup> single realization of connected (dotted lines) and unconnected (dashed lines) fracture <sup>1011</sup> networks. Steam saturation of the fractures  $S_s^f$  is (a, d) 0%, (b, e) 50% and (c, f) <sup>1012</sup> 100%.

4 (a, b, c) P- and (d, e, f) S-wave velocities as functions of steam saturation  $S_s^f$  for different fracture connectivity scenarios. Blue lines correspond to the elastic high-frequency limit and red lines to seismic frequencies within the non-dispersive plateau. The relative velocity change for each connectivity level (g, h, i) is computed as  $\Delta V = \frac{V_{P,S}(S_s^f) - V_{P,S}(S_s^f=0)}{V_{P,S}(S_s^f=0)}$ , and is shown for  $V_P$  (continuous lines) and  $V_S$  (dashed lines).

(a) Crossplot of  $V_P/V_S$  against  $V_P$ . Orange dots correspond to randomly 51019 connected fracture networks with a fixed fracture density Fd of 1% and varying  $S_s^f$ , 1020 from 0 to 100%. Blue dots were taken from Quiroga et al. (2022) and correspond 1021 to fracture networks with identical fracture properties, varying fracture density from 1022 0.25% to 0.9% and water ( $K_f$  = 2250 GPa,  $\eta$  = 1 $e^{-3}$  Pa.s) as the saturating fluid. 1023  $V_P$  values are normalized with respect to the respective maximum values for ease of 1024 comparison.  $V_P$ -values for variable fracture density are divided by the value of  $V_P$  for 1025 Fd = 0.25% and the V<sub>P</sub>-values for variable fracture steam saturation by the value 1026 of  $V_P$  for  $S_s^f = 0\%$ . (b)  $V_P/V_S$  ratio as a function of Fd for fracture networks with 1027 full water saturation. (c)  $V_P/V_S$  ratio as a function of  $S_s^f$  for fracture networks with 1028 fracture density  $F_d = 1\%$ . 1029

<sup>1030</sup> 6 Schematic representation of the geothermal reservoir model employed in the <sup>1031</sup> analysis. The sandstone and intact granitic layers are considered to be homogeneous,

while the granitic reservoir is characterized as a fractured formation with the fractures being saturated with either water and steam (upper part of the reservoir) and only water (lower part of the reservoir).

7 (a, b) Phase and group velocity dispersion of Rayleigh waves for the model 1035 described in Table 3 for different levels of steam saturation in the upper part of the 1036 reservoir, considering (a) a poroelastic and (b) an elastic approach. Relative velocity 1037 difference  $(\Delta V_p, g(S_s^f))$  for phase (solid lines) and group velocities (dashed lines) for 1038 (c) poroelastic and (d) elastic approaches. Relative velocity differences are computed 1039 as the maximum difference between the dispersion at a certain steam saturation and 1040 the dispersion corresponding to a steam saturation of 0% divided by the value of the 1041 latter. 1042

<sup>1043</sup> 8 P-wave reflection coefficient and AVA coefficients for the interface between <sup>1044</sup> the partially steam-saturated upper part of the reservoir and the water-saturated <sup>1045</sup> lower part of the reservoir. (a) Reflectivity as a function of angle and  $S_s^f$  (100% red, <sup>1046</sup> 50% yellow, and 10% blue) for poroelastic (continuous lines) and elastic approaches <sup>1047</sup> (dashed lines). Results for the inversion using (b) Shuey's and (c) Fatti's approxi-<sup>1048</sup> mations for incidence angles between 0° and 50°. Inversion results are shown for the <sup>1049</sup> poroelastic (dots) and for elastic (crosses) approaches.

<sup>1050</sup> 9 P-wave reflection coefficient as a function of incidence angle for the interfaces <sup>1051</sup> between: a partially steam-saturated upper part of the reservoir and a fully water-<sup>1052</sup> saturated lower part of the reservoir (solid lines); a fully water-saturated upper part <sup>1053</sup> of the reservoir with varying fracture density Fd over a fully water-saturated lower <sup>1054</sup> part of the reservoir with a Fd=0.25% (dashed lines). Results for the inversion using

#### Seismic signatures of steam

<sup>1058</sup> B-1 Standard deviations of (a, c, e) P- and (b, d, f) S-wave velocities for the <sup>1059</sup> non-dispersive plateau as functions of the number of realizations for (a, b) connected, <sup>1060</sup> (c, d) unconnected, and (e, f) randomly connected samples. Colors denote the per-<sup>1061</sup> centage of steam saturation of the fractures for each series of realizations.

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1 Properties of intact granitic background and embedded fractures. Granite properties were taken from Detournay and Cheng (1993). Fractures are represented as highly compliant, porous, and permeable inclusions, whose grain-level properties correspond to those of the embedding background (Rubino et al., 2017). Fluid properties correspond to a temperature of 350 degrees Celsius and a pressure of 167 bar for brine, and the same temperature and a pressure of 165 bar for steam. These properties are obtained from the XSTEAM matlab routine (Holmgren, 2006).

<sup>1070</sup> 2 Mechanical properties of fractured granite with variable fracture densities. <sup>1071</sup> These characteristics correspond to randomly connected fractured granite saturated <sup>1072</sup> with brine ( $K_f = 2250GPa, \eta = 1e^{-3}Pa.s$ ) for different Fd values. These values <sup>1073</sup> correspond to frequencies in the non-dispersive plateau. Taken from Quiroga et al. <sup>1074</sup> (2022).

<sup>1075</sup> 3 Properties of the geological model