

25 **Abstract**

26 Forecasting the shape of a microseismic cloud is essential to pre-design an energy extraction
27 system. The microseismic cloud produced after hydraulic stimulation is empirically known to
28 extend to the maximum principal stress direction. However, this empirical relationship is
29 inconsistent with the results of some studies, and the cloud growth process has not been fully
30 understood. This study investigates the microseismic cloud growth process using microseismic
31 data derived from a stimulation in Basel, Switzerland and considering its correlation with *in-situ*
32 stress. We applied principal component analysis to a time series of microseismic distribution for
33 macroscopic characterization of microseismic cloud growth. The least orientation of the
34 microseismic cloud was stable and almost identical to minimum horizontal stress. The most
35 extensive orientation experienced some dip angle during stimulation, although it had become
36 almost vertical following injection. This suggests that microseismic cloud growth behavior was
37 different before and after stimulation, owing to the dynamic and static permeability tensor. There
38 was radial growth in the cross-sectional microseismic cloud along with the maximum horizontal
39 stress orientation. This is consistent with the nearly identical maximum horizontal and vertical
40 stresses. Microseismic clouds did not grow in the least principal stress direction due to low
41 permeability. However, the microseismic cloud extended between the orientation of the
42 maximum and intermediate stresses, reflecting their magnitude. These findings suggest that
43 microseismic cloud growth is mainly controlled by *in-situ* stress when various existing faults
44 exist. They also suggest the feasibility of forecasting microseismic reservoir shape from *in-situ*
45 stress before stimulation.

46 **Plain Language Summary**

47

48 **1 Introduction**

49 In the new plague era, a supply of stable energy is critically important to sustainably
50 maintain broad economic and social activities. Additionally, the transition from hydrocarbon
51 resources associated with carbon dioxide (CO₂) emissions to renewable energy is necessary to
52 mitigate global warming and various risks associated with global warming. Geothermal energy is
53 one of the most promising renewable energy sources as its stability is suitable for baseload.
54 There have been many attempts to increase geothermal energy use even in a non-volcanic region,
55 through an enhanced geothermal system (EGS). In EGS development, we extract geothermal
56 energy from deeper than the volcanic region to access economically competitive temperatures.
57 Based on the permeability and fluid richness condition in the target formation, an engineering
58 operation was employed to increase the permeability or feed fluid of the heat exchange medium;
59 that is, the hydraulic stimulation (hydro shearing). The injected water migrates via the existing
60 fracture system in the reservoir, and the increased pore pressure concurrently destabilizes each
61 existing fault. When friction decreases to a sufficient amount to yield shear stress, shear slip
62 occurs on existing fractures (Pine & Batchelor, 1984; Zoback, 2007), resulting in
63 microseismicity. This is the main part of the EGS engineering operation as shear slips on existing
64 fractures enhances permeability (Watanabe et al., 2008; Yeo et al., 1998). Measurement and
65 analysis of microseismicity are also essential parts of EGS, involving the monitoring of hydraulic
66 stimulation and visualization of the shape and geometry of the artificial reservoirs. Microseismic
67 data are often automatically processed, and the hypocenter locations of microseismicity are
68 routinely determined using automatically detected P and S-wave arrival. Due to uncertainty in

69 the phase arrival, microseismic hypocenters often show a cloud shape (i.e., the microseismic
70 cloud, herein referred as the MS cloud). Post analysis by experts includes refined phase picking,
71 relocation of the hypocenter, estimating the source parameter, and focal mechanisms. Relocated
72 hypocenter determinations delineate a much sharper existing fracture system as opposed to an
73 ambiguous MS cloud.

74 The shape or geometry of the EGS reservoir from microseismic monitoring is very
75 important in the design of sustainable energy extraction systems. This indicates the location of
76 production wells, the entire rock volume available for heat exchange, and reservoir management.
77 It has been considered that the MS cloud grows in the maximum principal stress direction of,
78 although this has not yet been proven; as such, the MS cloud growth process is not been fully
79 understood. The model for earthquake swarms in a volcanic region (Hill, 1977) has often been
80 used to interpret MS cloud growth (Evans et al., 2005; Häring et al., 2008). A similar model was
81 also proposed by Sibson (1996). In these models, the conjugate faults and dikes consist of the
82 fracture mesh model. At stimulation, optimally oriented faults to *in-situ* stress initially cause
83 shear slip with a minimum pore pressure increase. However, optimally oriented faults have
84 angles around 30° to the orientation of maximum principal stress; this is not the same orientation
85 as the maximum principal stress. Microseismic events often occur from both conjugates of
86 optimally oriented faults. Consequently, the MS cloud grows in the direction of maximum
87 principal stress from a macroscopic perspective, as presented in Häring et al. (2008).

88 This empirical interpretation does not always explain the observed MS cloud shape. For
89 the EGS reservoir of Basel, Switzerland and Soultz, France, both of which are from the Rhine
90 graben, the shape of the MS cloud was consistent with the maximum principal stress orientation
91 (Evans et al., 2005; Häring et al., 2008; Mukuhira et al., 2013; Soma et al., 2007). As a counter-
92 example, the hot fracture rock (HFR) project in the Cooper Basin, Australia had different
93 features. The MS cloud mainly consists of one or a few sub-horizontal fractures, and they
94 delineate thin and planar MS clouds (Baisch et al., 2006). The planar MS cloud did not grow to
95 the maximum principal stress orientation. Thus, the MS cloud of the Cooper Basin is heavily
96 controlled by the dominant horizontal existing fractures as opposed to *in-situ* stress. Another
97 counter-example is the case of the Fenton Hill HDR test site in the United States. The MS cloud
98 clearly did not extend to the maximum principal stress orientation (Norbeck et al., 2018). These
99 examples demonstrate that MS cloud growth behavior has not yet been fully understood, and
100 further clarification on its correlation to *in-situ* stress, existing fracture distribution, and pore
101 pressure is required.

102 This study investigates MS cloud growth behavior and the influence of *in-situ* stress. It
103 utilizes well-recorded microseismicity, *in-situ* stress, and existing fracture data from the case
104 study EGS project in Basel, Switzerland. Then, it discusses whether the insights from the
105 analysis of this case study may explain MS cloud growth behavior of other fields based on the
106 distinction between *in-situ* stress and existing fracture data.

107 **2 Data and Methods**

108 2.1 Field description

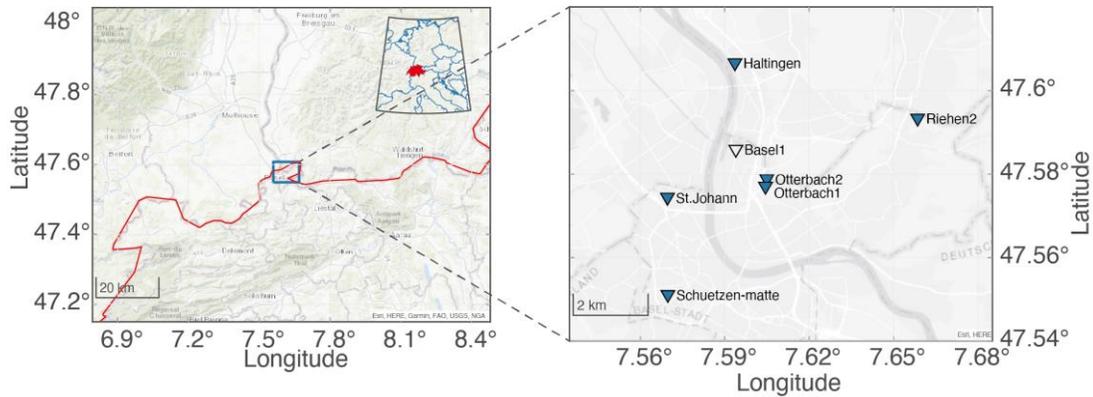
109 We studied microseismic activity observed at the hydraulic stimulation of the EGS
110 project in Basel, Switzerland, in 2006. The EGS project used hydraulic stimulation to create an
111 artificial geothermal reservoir for electricity and heat supply as a cogeneration system. Basel is

112 located at the southern end of the Upper Rhine graben, characterized by the highest geothermal
113 potential in Europe (Figure 1). The injection well, Basel-1, was drilled in the urban part of the
114 city, to a depth of approximately 5000 m from the surface. Following the sedimentary part up to
115 2500 m, the granite basement formation had begun beyond this depth. The casing shoe was
116 approximately 4630 m, and the remaining 400 m of the open-hole section was subjected to
117 stimulation. Injected water penetrated the formation via several permeable zones in the open-
118 hole section (Häring et al., 2008). Hydraulic stimulation was conducted for approximately five
119 days, beginning on December 2, 2006. The maximum flow rate was 3300 L/min, accompanied
120 by a wellhead pressure reaching 29.6 MPa. Hydraulic stimulation successfully caused numerous
121 microseismicities. Seismic activity increased with flow rate and wellhead pressure, and the MS
122 cloud was extended with the hydraulic stimulation process. On the fifth day of hydraulic
123 stimulation, microseismic activity had been raised unfavorably. Despite efforts to reduce the
124 flow rate and seismic activity, several felt events, including the largest event (Mw 3.41),
125 occurred during the shut-in phase (Häring et al., 2008; Mukuhira et al., 2013). Microseismic
126 activity continued even after half a year following the commencement of stimulation (Mukuhira
127 et al., 2013), and seismic activity is continuing to occur (Herrmann et al., 2019).

128 2.2 Microseismic data

129 The primary operator, Geothermal Explorers Ltd. (GEL), installed a microseismic
130 network consisting of six downhole seismometers and one temporal sensor in the injection well
131 (Figure 1). The deepest seismometer, Otterbach 1 (OT1), was installed at the top of the granite
132 section, and other seismometers were in the sediment. One geophone was deployed in Basel1 at
133 4720 m from the surface. This attempt was intended to acquire the signal of events that occurred
134 at the very early stage of stimulation, assuming that those events occurred within 100 m from the
135 injection point. The data from these events were used to calibrate the initial velocity model
136 estimated from P and S-wave velocities based on sonic velocity measurements. Following this, a
137 one-dimensional (1D) and one layer (i.e., between sediment and granite) velocity model was
138 used for hypocenter determination by GEL (Dyer et al., 2008).

139 Once the amplitude exceeded the predetermined threshold based on the background noise
140 at the OT1 station, the 6 s waveforms at all stations were flagged as potential events. Then, P and
141 S-wave arrivals were automatically detected and sent to the hypocenter determination process.
142 The initial hypocenter was determined using the grid-based migration method, and events with
143 an RMS misfit of more than 10 ms were discarded. Until the tenth day from the beginning of
144 stimulation, the microseismic monitoring system detected around 13 500 triggers of potential
145 events, whereby ~3100 events were located. Dyer et al. (2010) improved the hypocenter location
146 of microseismic events by applying cross-correlation picking and multiplet analysis.

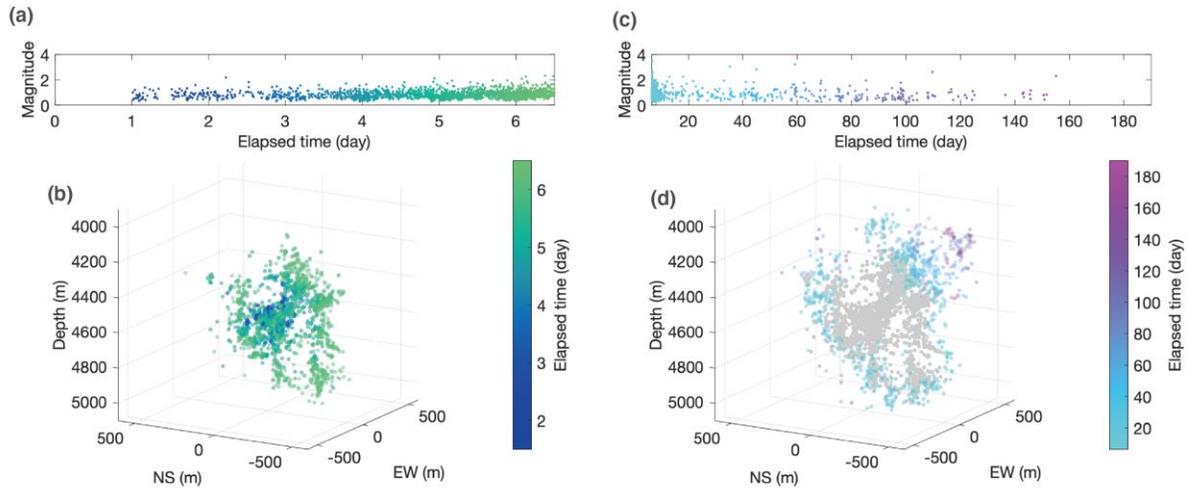


147

148 **Figure 1.** The location of the Basel Switzerland in the left panel, and the microseismic
 149 monitoring network of Basel EGS project in Basel city (blue triangles). The open triangle
 150 represents the location of the Basel1, injection well.

151 Asanuma et al. (2007) provided an independent analysis using the same velocity model
 152 and a manually refined pick. They then determined the hypocenter location that was almost
 153 identical to that found by Dyer et al. (2008). They also applied multiplet analysis and found that
 154 70% of microseismic events were multiplets. Relocated hypocenters using a double difference
 155 method (Waldhauser & Ellsworth, 2000) delineated several sub-fractures in the reservoir
 156 (Asanuma et al., 2008). This study was based on the hypocenter location elucidated by Asanuma
 157 et al. (2008). The spatial error in the hypocenters of absolute locations was approximately 40 m,
 158 corresponding to 5 ms in RMS, and the relative error was less than 10 m. The error distribution
 159 based on the microseismic monitoring network showed a vertical ellipsoid that was satisfiable
 160 compared to other cases (Asanuma et al., 2007). The MS cloud had a sub-vertical geometry
 161 striking the NNW-SSE direction in a macroscopic sense.

162 Figure 2 shows the macroscopic overview of the MS cloud in three dimensions for the
 163 stimulation (~shut-in) and post-injection (6 months) time periods. Microseismic activity had
 164 commenced near the injection point and expanded in all directions. During the shut-in and
 165 bleeding off phase (~5 d from the shut-in), pore pressure re-distribution occurred. This caused
 166 very active microseismic activity in the periphery of the previously stimulated region (see details
 167 in Mukuhira et al., 2017). Post-stimulation microseismic activity is shown in Figure 2(c) and
 168 2(d). Following the shut-in phase, microseismic activity had become gradual, and microseismic
 169 events mostly occurred from the shallower part of the reservoir (Figure 2(d)). Our data included
 170 microseismic activity until the 180th day from the commencement of stimulation; continuous
 171 microseismic activity has previously been observed even after a decade from stimulation
 172 (Herrmann et al., 2019).



173

174 **Figure 2.** a) Magnitude-time (M-t) plot for stimulation period; and c) until the half-year from
 175 stimulation. The color in the M-t plot indicates the occurrence time of each microseismicity; b)
 176 and d) three-dimensional panels show the hypocenter distribution of microseismic events for
 177 each time period. The color corresponds to the occurrence time of events from the beginning of
 178 injection. The gray dots in d) show the hypocenters of events shown in the left panel.

179 2.3 Principal component analysis

180 We employed principal component analysis (PCA) to the MS cloud to characterize the
 181 MS cloud shape quantitatively and statistically. PCA is a data analysis technique to understand
 182 data, and is applicable even to high dimensional data. PCA analysis can also decompose high
 183 dimensional data to lower dimensions, and has often recently been used in unsupervised machine
 184 learning analysis. In practice, principal components in this case are computed by eigen
 185 decomposition of the data covariance matrix, and principal components are considered
 186 eigenvectors of the covariance matrix. We applied PCA analysis to microseismic hypocenters
 187 consisting of the MS cloud and then extracted the three principal components to understand the
 188 hypocenter distribution of microseismic events. The microseismic hypocenter variance was at its
 189 maximum along with the first principal component, which means that the MS cloud had
 190 extended to the direction of the first principal component.

191 Effectively, PCA analysis with three orthogonal bases attempts to model the MS cloud
 192 with an ellipsoid defined with three component vectors as three axes. The lengths of each axis of
 193 the ellipsoid may be estimated assuming the dataset adopts a Gaussian distribution to each axis.
 194 In this case, the lengths of each axis were computed as the square root of variance by a factor of
 195 three; the ellipsoid defined in this way should include 99 % of microseismic events. The
 196 uncertainty of the hypocenter would not affect the PCA results as the error ellipsoid shape for
 197 each event in the reservoir was more or less similar (Asanuma et al., 2007). PCA treats the
 198 distribution of microseismicity in a macroscopic way, and even considerable uncertainty for one
 199 particular event does not materially impact the PCA. It should be noted that the principal
 200 components in this analysis were defined as left-handed coordinate systems.

201 2.4 *In-situ* stress data

202 The orientation and magnitude of the *in-situ* stress have been investigated using borehole
 203 logging data (Valley & Evans, 2009, 2015, 2019). Based on borehole logging analysis, the
 204 orientation of the maximum horizontal stress was estimated to be $N144^{\circ}E \pm 14^{\circ}$ based on
 205 borehole breakout and drilling-induced tensile fracture data (Valley and Evans, 2009). In
 206 previous studies (e.g., Mukuhira et al., 2018), we used the *in-situ* stress magnitude model
 207 proposed by Valley and Evans (2015). Recently, Valley and Evans (2019) revised the *in-situ*
 208 stress magnitude based on careful and comprehensive consideration of borehole breakout,
 209 drilling induced tensile fracture, and several failure criteria. The linear depth trends of stress
 210 magnitude proposed by Valley and Evans (2019) were $S_v = 24.9z$, $S_{hmin} = 7 \times z + 42$, and $S_{Hmax} = 5 \times z$
 211 $+ 90$; the unit of stress is MPa, and z is the depth from the surface. This small gradient, S_{Hmax} ,
 212 leads to the stress state transition at 4200 m from strike-slip to normal faulting below. The
 213 estimated *in-situ* stress model was consistent with the observed mix of strike-slip and normal
 214 fault-type focal mechanisms of larger induced seismic events (Deichmann and Giardini, 2009).
 215 We use this *in-situ* stress model, assuming a laterally homogeneous reservoir region for
 216 comparison to MS cloud growth and interpretation. Note that this *in-situ* stress itself does not
 217 affect the results of the analysis.

218 3 Results

219 3.1 Three dimensional MS cloud growth

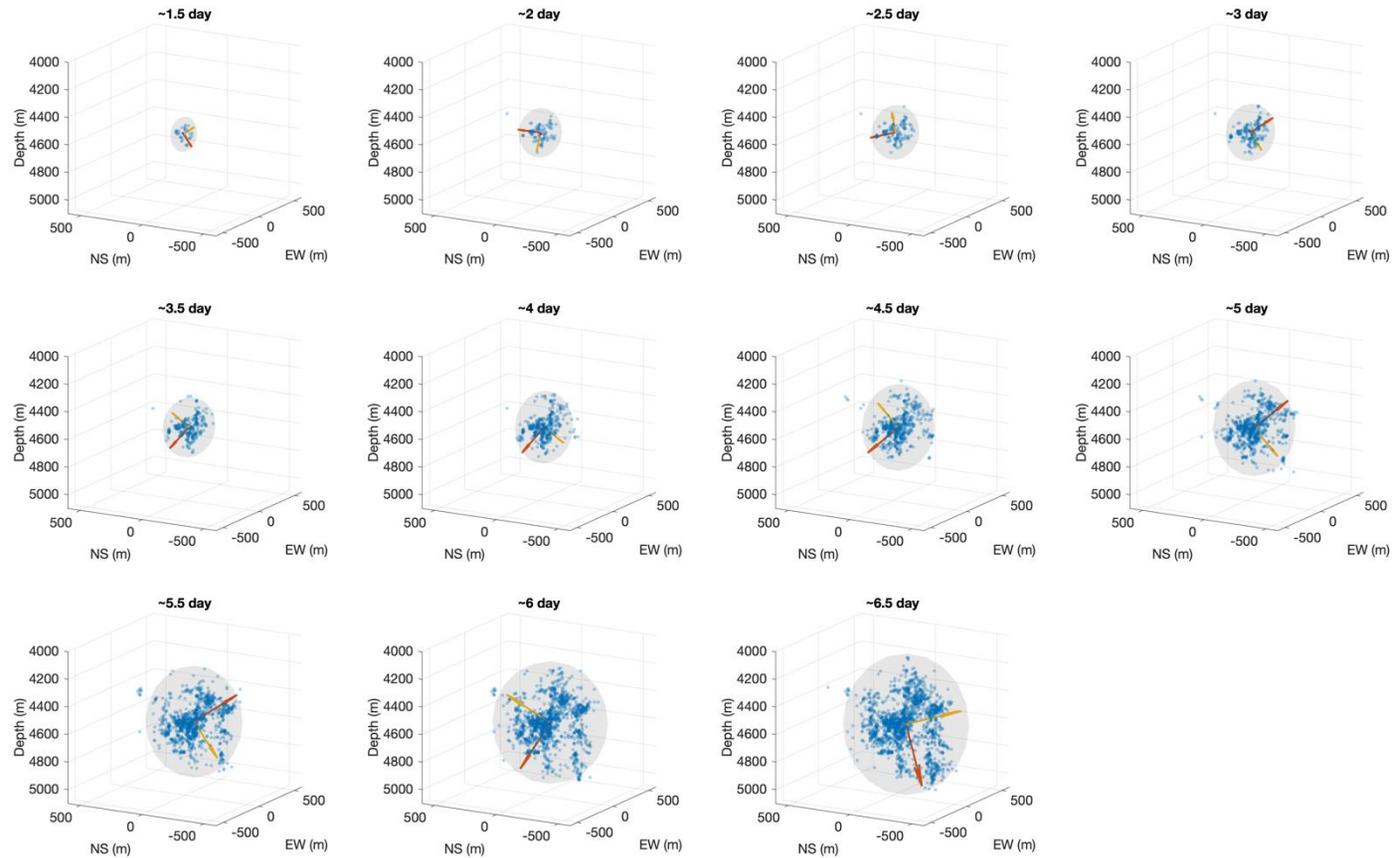
220 First, we focused on MS cloud growth during the stimulation period, from the beginning
 221 of the stimulation to the shut-in. We computed three PCA components of the MS cloud every 0.5
 222 d. The MS cloud of each time step included all microseismic events that occurred before the
 223 target time. Figure 3 shows the three dimensional (3D) microseismic distribution for each time
 224 step and the ellipsoids defined with three PCA components. The distribution of microseismic
 225 events changed with time; however, the ellipsoids shown in Figure 3 did not change
 226 significantly. The orientations of the first and second PCA components, depicted by the red and
 227 yellow arrows, dynamically changed with time. The first PCA component was more horizontal
 228 in the early few days and commenced dipping around 45° from the horizontal on the third day.
 229 The first and second components were more or less constant during the stimulation. It should be
 230 noted that PCA estimates the orientation of the first and second components based on the entire
 231 data distribution. At times, the direction of components switches 180° according to the local and
 232 temporal progress of the MS cloud. Figure 3 shows that the first and second components
 233 switched the directions at 4.5 and 5 d. Still, we did not consider the orientation of the arrow in
 234 this analysis due to symmetricalness to *in-situ* stress. At the last time step of 6.5 d, the orientation
 235 of the first and second PCA components changed, exhibiting different behavior compared to that
 236 during stimulation. It should be noted that wellhead pressure decreased due to flow rate
 237 reduction from 6 to ~ 6.5 d. As such, the microseismic activity in this time period was not the
 238 same as that during stimulation, based on the pore pressure migration behavior (Mukuhira et al.,
 239 2017).

240 The orientation of the computed PCA components are summarized in the lower
 241 hemisphere plot in Figure 4(a)–4(c); the time series change of MS cloud growth orientation is
 242 represented. We observed that in the third PCA component, the least orientation of MS cloud
 243 growth was constant and almost identical to the minimum horizontal stress, S_{hmin} . In contrast, the

244 first and second PCA components changed in the plane perpendicular to the orientation of S_{hmin} .
245 As observed in Figure 3, the first PCA components were oriented horizontally, then dipped
246 around 45° mid stimulation, and finally ended at a near vertical orientation. Figure 4(d) shows
247 the time series changes of each PCA component length, whilst Figure 4(e) shows the aspect ratio
248 of the ellipse defined for the first and second PCA components to the third one. The first and
249 second PCA components were nearly similar in length throughout the stimulation period. In
250 contrast, the third PCA component grew up to 120 m at most, this was around one-fourth of the
251 other PCA components. The aspect ratios between components varied together between 2.5 and
252 4. The result of PCA analysis for incremental time step is shown in Figure S1, the result is
253 almost same to those shown here.

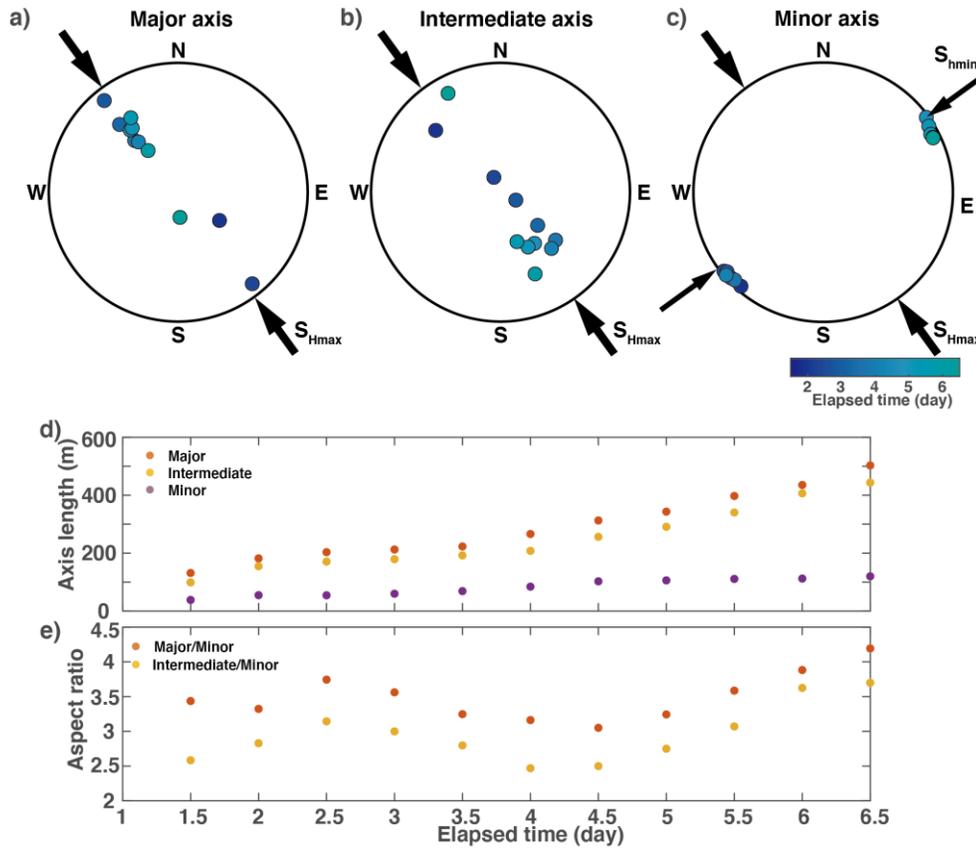
254

255



256

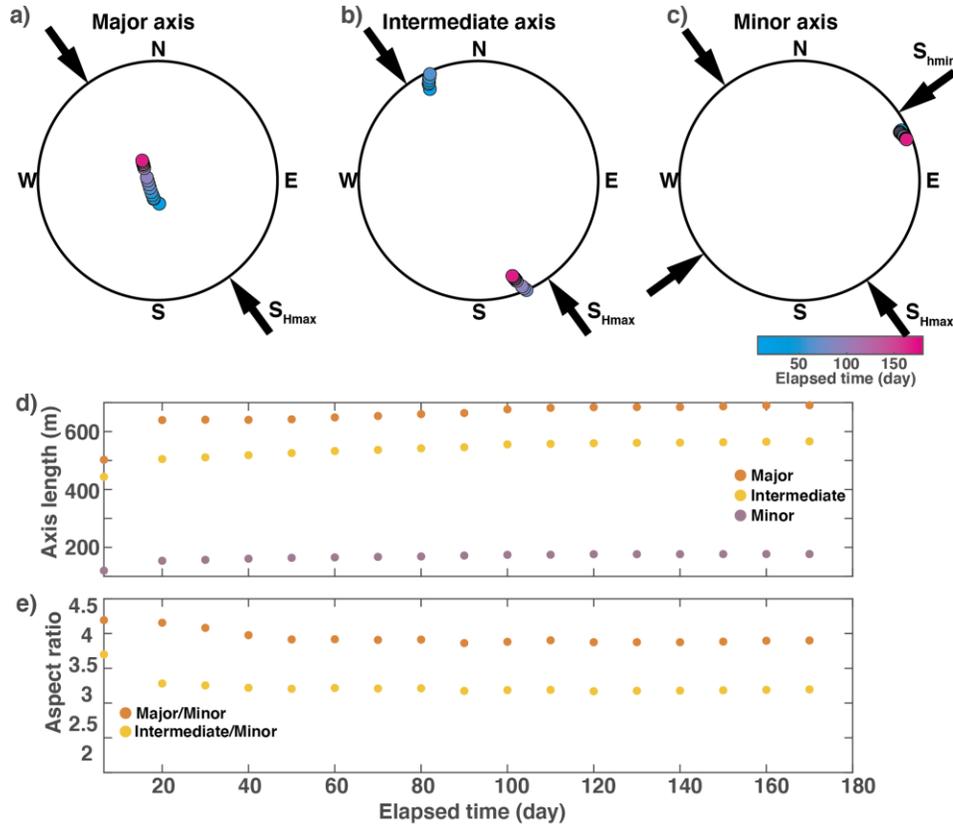
257 **Figure 3.** Snapshots of the 3D hypocenter distribution of microseismic events taken every 0.5 d from the beginning of stimulation.
 258 The red, yellow, and purple arrows correspond to the first, second and third PCA analysis components that describe representative
 259 ellipsoids for MS clouds at each time.
 260



261

262 **Figure 4.** Time series change of first, second and third PCA component vectors: a) major; b)
 263 intermediate; and c) minor axes orientation for representative ellipsoids in the lower hemisphere
 264 projections. The presented PCA components vectors are the same to those shown in Figure 3; d)
 265 time series for change of PCA component length (major, intermediate, and minor axes lengths);
 266 and e) the aspect ratio between the first to third PCA component length (red) and second to third
 267 PCA component length (yellow).

268 PCA analysis was conducted on the microseismic data in the post-injection phase.
 269 Microseismic activity in the post-injection phase was significant only a few days following the
 270 shut-in, and then the seismic activity had nearly ceased. Therefore, a dynamic change in MS
 271 cloud growth was not observed (Figure S2). Figure 5 shows the time series changes of the three
 272 PCA components for every ten days. Based on Figure 5(a)–5(c), the orientation of each PCA
 273 component was almost constant. The first PCA component was nearly vertical, and the second
 274 component was virtually identical to the orientation of S_{Hmax} . The third PCA component was
 275 consistent with the orientation of S_{hmin} during stimulation. Therefore, we observed a significant
 276 transition of MS cloud growth behavior during and after stimulation. In the first 14 d of the post-
 277 injection phase, which had begun 6.5 d from the commencement of injection, the MS cloud had
 278 the greatest extension. The first PCA component was significantly extended, causing a greater
 279 distinction to the second PCA component (Figure 5(c)). After 20 d, the MS cloud was slightly
 280 extended, and the orientation of the PCA components was also stable. It should be noted that
 281 most of the microseismic activity during the post-injection phase was observed in the shallow
 282 part of the reservoir (Figure 2(d)). Due to the small number of events, PCA analysis is not
 283 performed for incremental data.



284

285 **Figure 5.** The results of PCA analysis for the MS cloud during the post-injection phase. All
 286 panels are shown in the same manner as Figure 4.

287 **3.2 Depth sectional MS cloud growth**

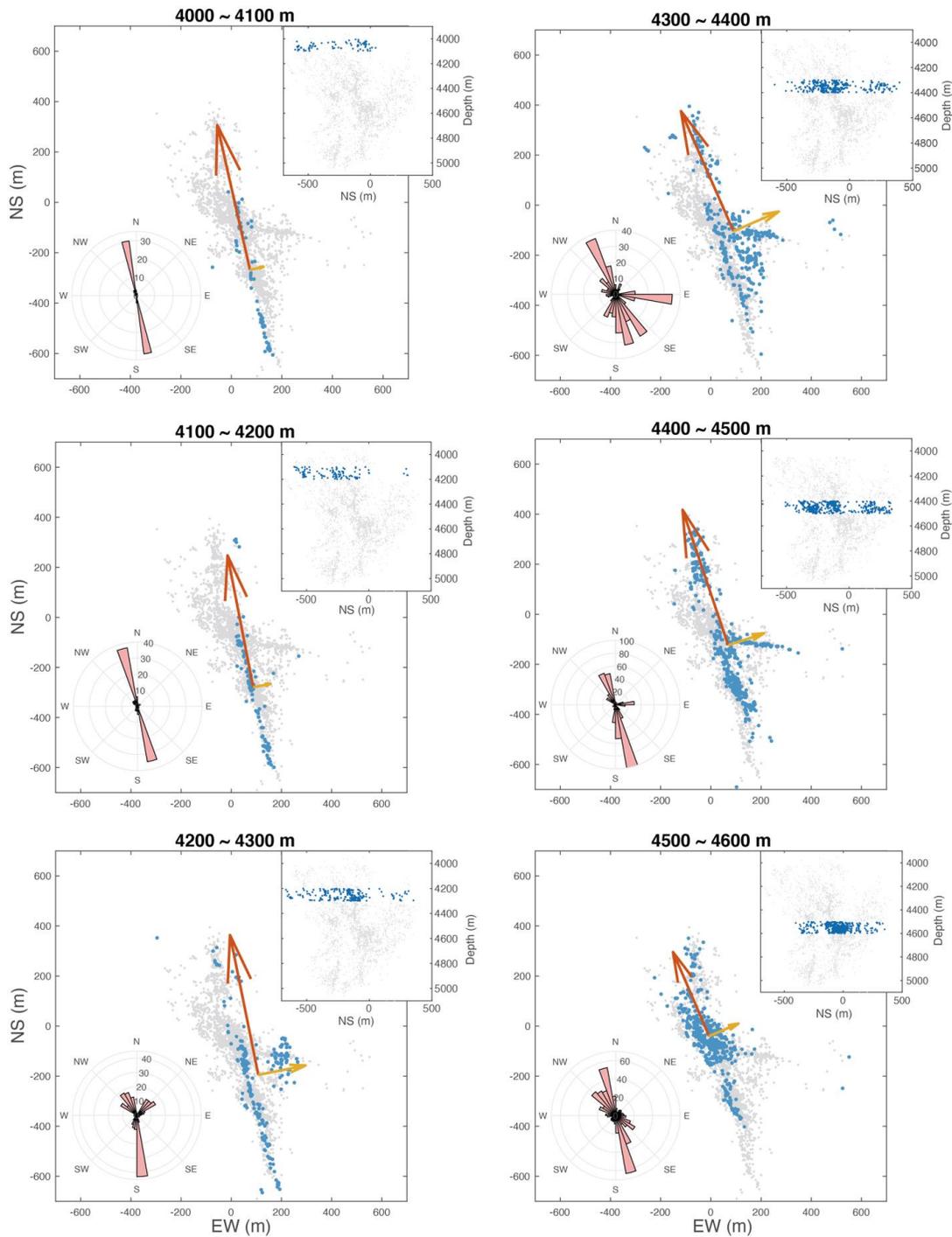
288 We investigated the MS cloud shape further at different depths and examined the
 289 influence of depth dependent *in-situ* stress. We applied PCA to microseismic events from a 100
 290 m width different depth section. We computed only two PCA components, ignoring depths of
 291 each microseismic event. Each depth section for this analysis did not overlap, and microseismic
 292 events that occurred from the same vertical existing fault were contained over several depth
 293 sections. In addition to the PCA components, the geometric relationship between the gravity
 294 point of the MS cloud to each hypocenter was summarized as a rose diagram in a subset for each
 295 panel of Figure 6.

296 We observed a very linear MS cloud shape in the shallower part of the reservoir (4000–
 297 4200 m), where almost no variation in the fracture was delineated by microseismicity. From
 298 ~4200 m, we observed that the MS cloud had begun thickening by the events that occurred from
 299 different fractures. These features resulted in the extension of the second PCA component and an
 300 elliptical shape for the entire MS cloud. This tendency was also observed in the MS cloud at
 301 deeper depths (4200–4700 m). In the 4300–4400 m depth section, the MS cloud was very sparse,
 302 and the rose diagram showed very different shapes to those at shallower depths. Seismic activity
 303 was observed in branch fractures striking EW at 4400–4500 m. At this depth, the northern MS
 304 cloud appeared independent of the main and southern parts of the MS cloud. In the next depth
 305 section of 4500–4600 m, the densest seismic activity moved slightly north, as demonstrated by

306 the gravity point of the MS cloud. In the deeper part of the reservoir, the MS cloud was divided
307 into northern and southern parts by the aseismic region.

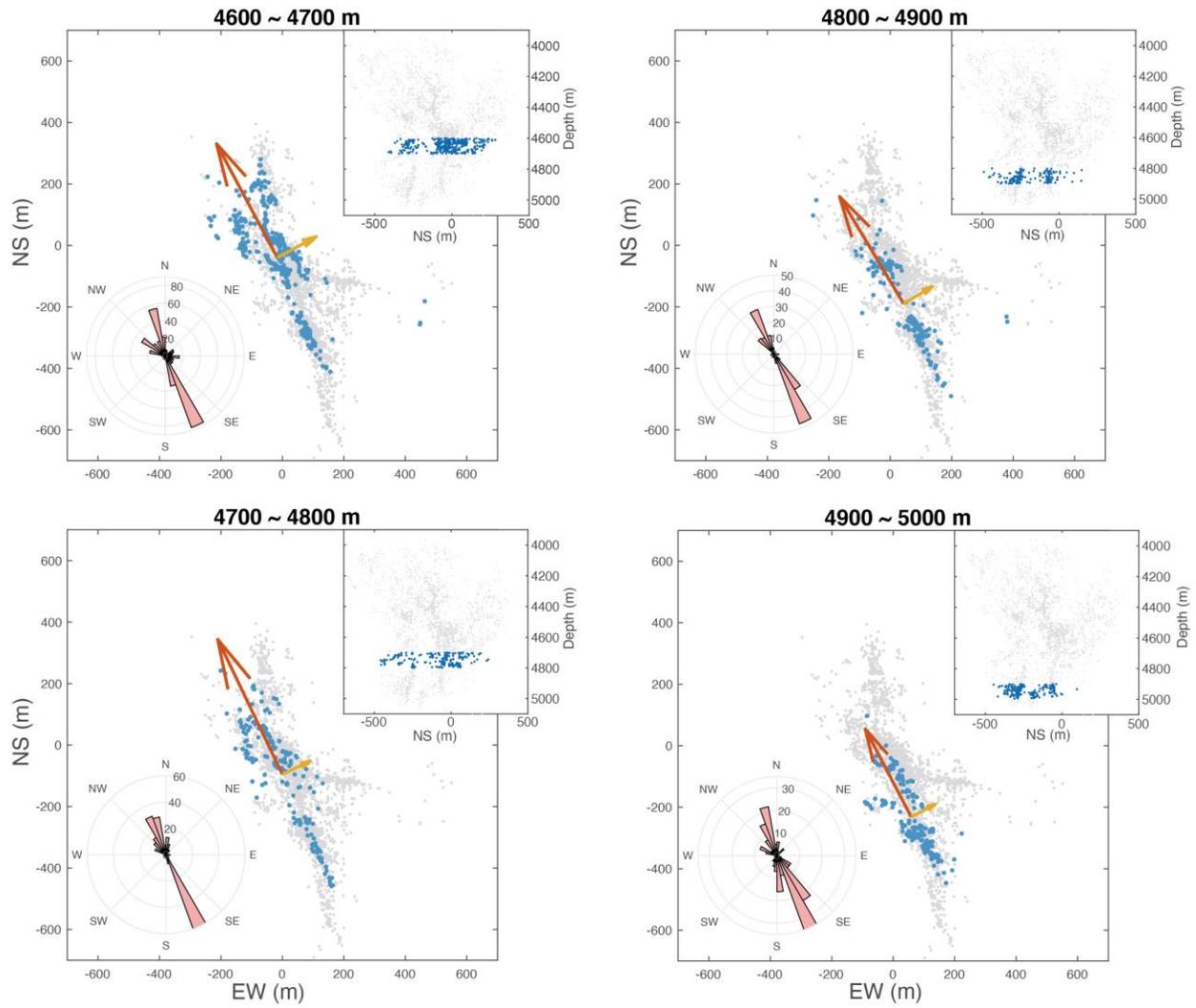
308 Despite the depth dependent features of microseismic activity and associated MS cloud
309 shape, the macroscopic trend of the MS shape had been maintained as the MS cloud extended the
310 orientation almost identical to the S_{Hmax} . Figure 7(a) summarizes the azimuths of the first PCA
311 component variation and depth, and shows that the azimuth of the first PCA component had
312 slightly rotated from north to east, with an increase in depth. This rotation may be attributed to
313 the difference in microseismic activity at each depth. We visualized the existing fractures
314 delineated by multiplet analysis (clustering analysis) at each depth in Figure S3. The aspect
315 ratios of the MS cloud at each depth were between two and four, with the exception of depths at
316 4700–4800 m, as shown in Figure 7. At shallower depths, the aspect ratios exceeded 6; these
317 exceptionally high aspect ratios reflect the linear shape of the MS cloud at shallower depths. It
318 should be noted that the majority of the events from ~4200 m occurred following the shut-in
319 operation.

320 As we investigated the MS cloud shape in different depth sections ignoring depth, we
321 estimated the horizontal stress ratio defined as $(S_{Hmax}-p_{hyd})/(S_{hmin}-p_{hyd})$ in each depth (Figure
322 7(b)); this was around 2.3 in the reservoir depth (Figure 7(c)). The horizontal stress ratio was not
323 the same as the aspect ratio of the MS cloud, although it is fairly consistent with the aspect ratio
324 from the MS cloud growth except for the shallow two sections.



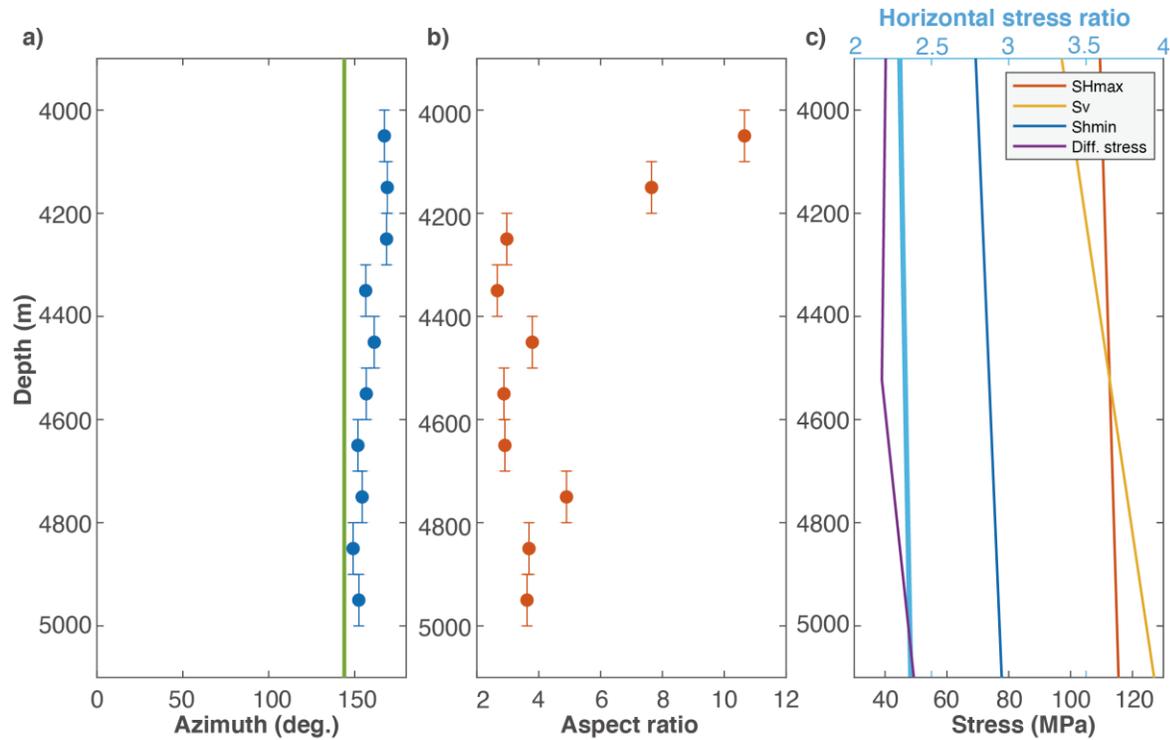
325

326 **Figure 6.** Hypocenter distribution of events for different 100 m depth sections in horizontal
 327 view. The blue dots are the event hypocenter in the target depth. The results of the 2D PCA
 328 analysis are shown with two arrows. The right shoulder inset is an NS cross section showing the
 329 target depth. The gray dots denote all microseismic events. The left lower inset represents the
 330 rose diagram for geometrical orientations from the gravity point of target events to each event.



331

332 **Figure 6.** (continued).



333

334 **Figure 7.** a) Orientation of the first component of PCA analysis as a function of depth. The
 335 vertical bar indicates the depth section for analysis. The vertical green line shows the orientation
 336 of S_{Hmax} ; b) the aspect ratio between the lengths of the first and second components; and c) stress
 337 profile in study depth with horizontal stress ratio $(S_{Hmax}-P_{hyd})/(S_{hmin}-P_{hyd})$.

338

3.3 Injection depth MS cloud growth

339

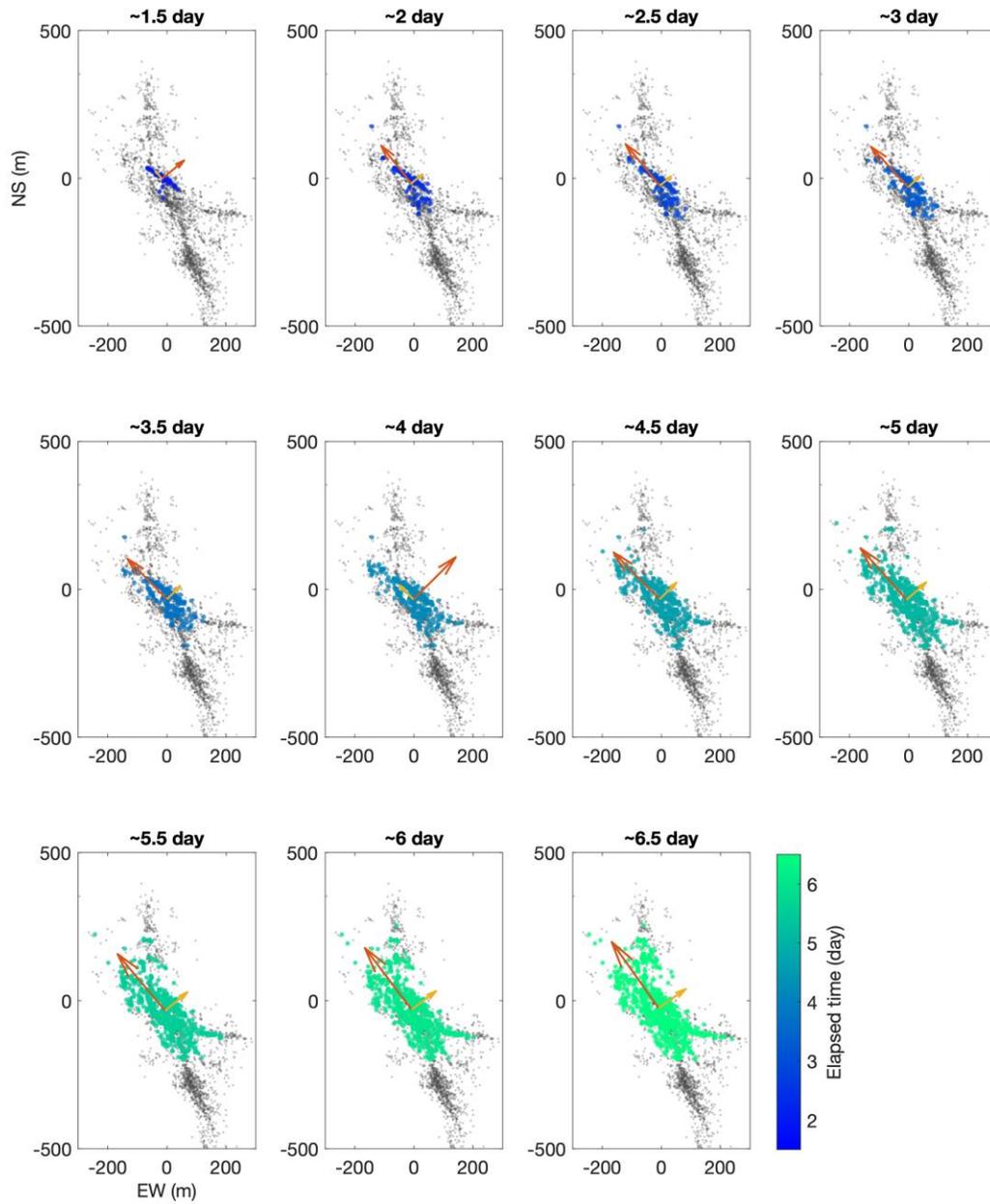
340 During injection, the injected pore pressure migrated from the feed point in the well to
 341 the formation. The pore pressure decayed with distance from the injection point based on the
 342 permeabilities of existing fractures of the flow path, connectivity of those, and injection pressure.
 343 Thus, pore pressure migration is a complicated and nonlinear phenomenon. It may be reasonably
 344 assumed that the pore pressure in the vicinity of the injection point was as high as that at the
 345 injection point, or the pore pressure decay was relatively small. Therefore, we may forecast that
 346 the MS cloud shape near the injection point was linear or simple during the initial stage of
 347 stimulation as only well oriented fractures may experience shear failure. Later, more non-
 348 optimally oriented existing faults cause shear slip as pore pressure increases, making the MS
 349 cloud more spherical in shape. We investigated the time series change of MS cloud shape with
 injection depth based on this working hypothesis.

350

351 We focused on an event that occurred between 4500 and 4700 m, including the main feed
 352 point of the cataclastic fracture zone (Häring et al., 2008). Microseismic events during the early
 353 stage of stimulation also occurred at this depth. We focused on an NS >-200 as we observed that
 354 the southern part of the MS cloud was divided by the aseismic zone and not directly connected to
 355 the injection zone in 3.2 (Figure 6). We applied 2D PCA to a time series of MS cloud growth at
 356 every 0.5 d (Figure 8). The MS cloud had been drop-shaped, extending to NW until 3.5 d of the
 357 stimulation, from which it displayed greater linearity. After 3.5 d, the MS cloud became thicker
 with time, and its shape became more elliptical. Time incremental analysis result is shown in

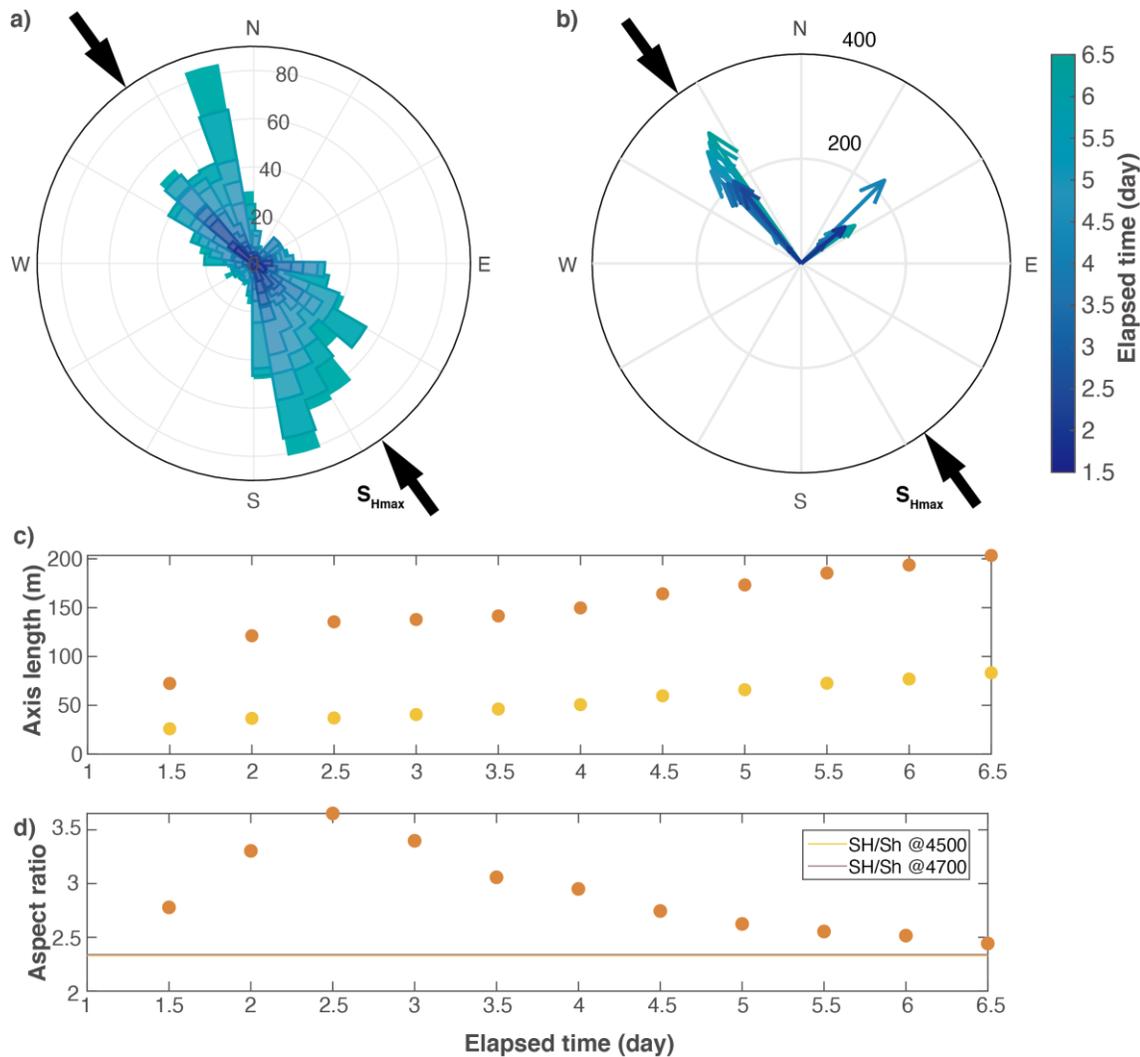
358 Figure S4. The relative geometry to the MS cloud gravity point is summarized in Figure 9(a) in
359 the same manner as Figure 6. The contribution to whole MS cloud shape from each existing
360 fracture is delineated with the microseismic clusters (Figure S5).

361 The time series change in the first and second PCA components and their lengths are also
362 summarized in Figure 9b. The rose diagram shape and orientation of the PCA components varied
363 slightly with time. During the stimulation phase, the rose diagram shape had somewhat changed,
364 suggesting that more events occurred in the north direction. The orientation of the first PCA
365 component was more or less stable during stimulation. The aspect ratio increased gradually,
366 reflecting a more linear MS cloud shape during the early stage of the stimulation. After 2.5 d,
367 this ratio decreased as the MS cloud became thicker; the aspect ratio varied between 2.5 and 3.5.
368 Note that the horizontal stress ratio (p_{hyd} deducted) in this depth section was approximately 2.34.



369

370 **Figure 8.** Time series evolution of microseismic events at an injection depth of 4500~4700 m.
 371 The 2D PCA results are shown with two arrows; red: first component, yellow: second
 372 component.



373

374 **Figure 9.** a) Rose diagram of geometrical orientations from gravity point to each event. The
 375 color of the rose diagram corresponds to the analysis time; b) time series change of orientation
 376 and length of first and second component of PCA. Color correlates analysis time; c) length of
 377 first and second components of PCA analysis as a function of time; d) aspect ratio of first and
 378 second components of PCA analysis as a function of time compared with horizontal stress ratio
 379 at 4500 and 4700 m.

380

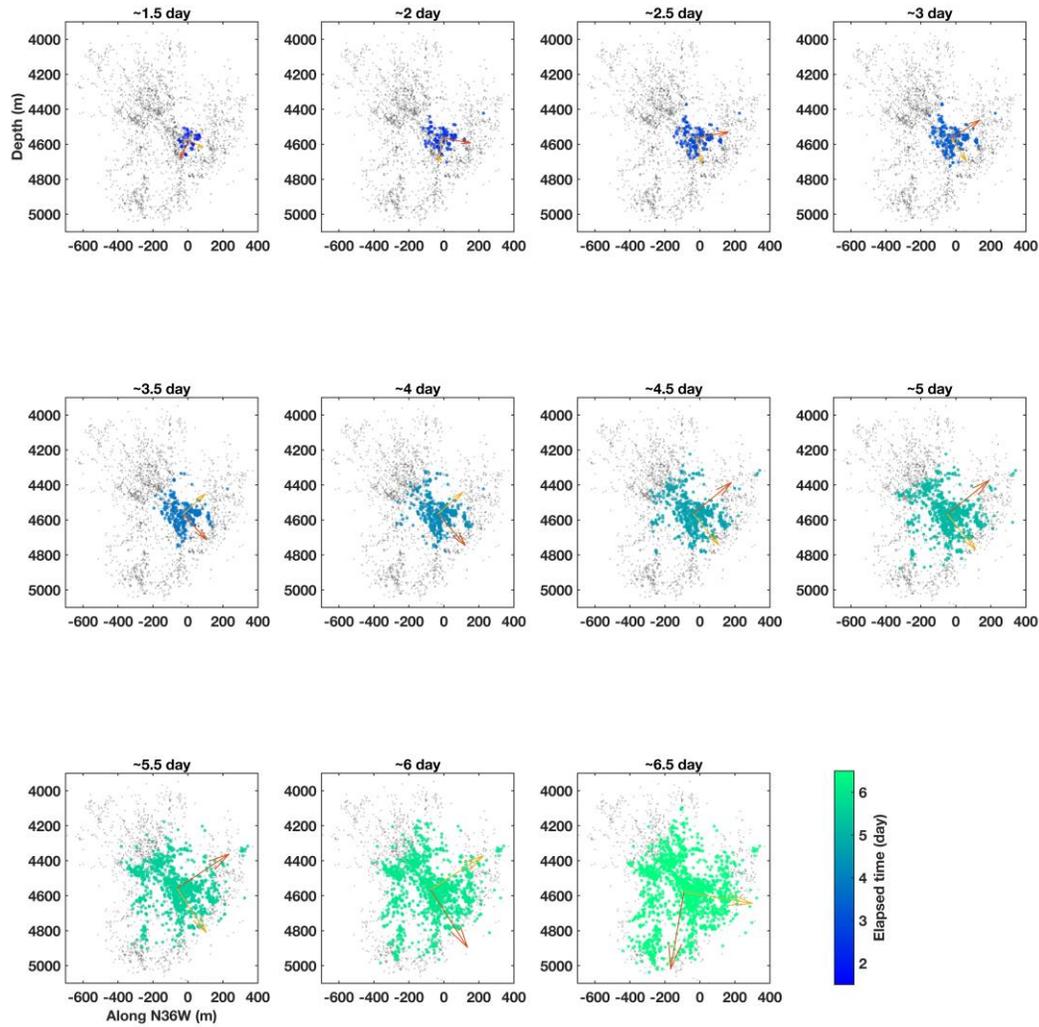
3.3 Cross sectional MS cloud growth

381 We observed the cross-sectional MS cloud growth along N144°E (N36°W), which is the
 382 orientation of S_{Hmax} . By visual inspection, the orientation that microseismic events distributed
 383 most was not always the orientation of S_{Hmax} (Mukuhira et al., 2017). Based on the results of
 384 PCA analysis performed in 3.1, and to investigate the influence of S_{Hmax} , we chose S_{Hmax}
 385 orientation. Fig. 10 shows the time series evolutions of the MS cloud along the N36°W cross
 386 section. We selected events that occurred within ± 200 m from N36°W for this analysis (Figure
 387 S6). Incremental time series analysis is shown in Figure S7 and multiplet analysis result in this
 388 manner is also shown in Figure S8.

389 In the first three time steps up to 2.5 days, the 1st PCA component was nearly vertical,
390 and the lengths of both the 1st and 2nd PCA components were close to each other. On the 3rd day,
391 one of the components started dipping. The lengths of 1st and 2nd PCA components were
392 competitive, so that the transition between 1st and 2nd PCA components occurred at 3.5, 4.5, and
393 6 days. The PCA component showed different behavior at the time step of 6.5 days and the 1st
394 PCA component oriented nearly vertically. These observations are the same as those from three-
395 dimensional observations in 3.1. In addition to the PCA results, we confirmed that the MC cloud
396 shape was a more or less circular shape. The aspect ratio was between 1–1.3 more stable than
397 that in the case of depth sectional observation (Figure 11(a)). The ratio between $S_{H_{max}}$ and S_v
398 was 1–1.15 in the target depth section (4200–5000 m), even though the stress transition occurs
399 from the strike-slip regime to the normal fault regime at around 4500 m (Figure 11(b)).

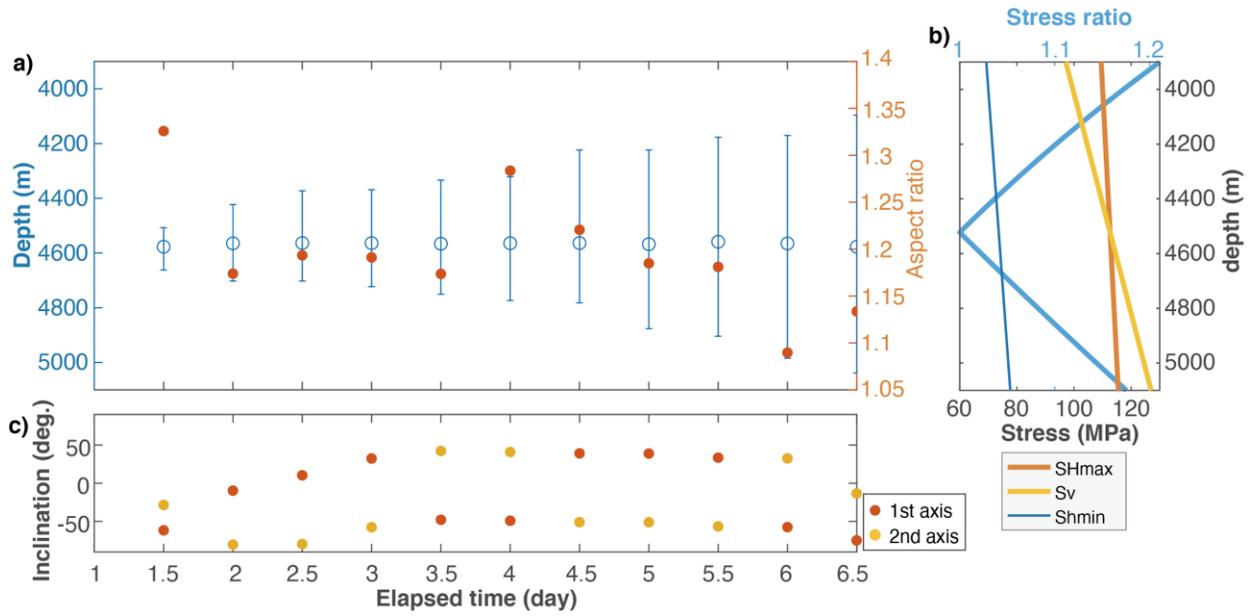
400

401



402

403 **Figure 10.** Time series evolution of microseismic events along the N35°W until 6.5 days from
 404 the stimulation start. Events that occurred ± 200 m along N36°W were plotted and analyzed. The
 405 2D PCA analysis results are shown with two arrows (red: 1st, yellow: 2nd components).



406

407 **Figure 11.** Correlation between MS cloud shape and in-situ stress. a) Circles corresponds to the
 408 gravity depth of the MS cloud, and the error bar corresponds to the upper and lower limits of the
 409 MS cloud. Red dots show the aspect ratio of the 1st and 2nd components of MS cloud. b) stress
 410 profile and stress ratio between vertical and maximum horizontal stress. c) inclination of 1st and
 411 2nd component. Downdip is negative in this figure.

412 4 Discussion

413 4.1 Permeability tensor delineated by MS cloud growth

414 We observed a significant change in the PCA component directions before and after the
 415 reduction of flow rate or shut-in. Dipping the first PCA component had become more vertical
 416 and remained constant after the shut-in. The first and second PCA component lengths were
 417 competitive during stimulation. The vertical expansion of the MS cloud after shut-in was
 418 attributed to the extension of the first PCA component and rotation of the first and second PCA
 419 component directions. PCA was applied for all events that had occurred during and after the
 420 shut-in. However, PCA applied to the MS cloud after the shut-in was also able to extract MS
 421 cloud growth well. The events that occurred during stimulation did not influence the PCA for the
 422 event that occurred after the shut-in because of the closeness of the first and second PCA
 423 components. Note that the third PCA component was constantly oriented to S_{hmin} for the entire
 424 study period.

425 The shape of the MS cloud was interpreted as three orthogonal vectors of permeability.
 426 We observed MS cloud growth as a result of pore pressure migration controlled by permeability
 427 in the reservoir. In a fractured reservoir, each fracture has a different permeability according to
 428 its geometry to the stress regime. It is reasonable to regard the aggregation of permeabilities of
 429 existing fractures as apparent permeability of the entire reservoir in a macroscopic way. Thus,
 430 three PCA components may be considered an effective permeability tensor in three dimensions.
 431 This is a similar concept to the diffusivity tensor proposed by Shapiro et al. (1999). In our case,
 432 the underlying physical and hydrological model is fluid flow in the fracture system as opposed to

433 anisotropic porous media. We do not intend to estimate the permeability tensor quantitatively,
434 although we investigate its qualitative features and its correlation to *in-situ* stress.

435 The transition of PCA component direction, the proxy of permeability tensors, suggests
436 that the apparent permeability tensors had significantly changed before and after the shut-in. This
437 indicates that the apparent permeability tensor delineated by MS cloud growth differed during
438 and after stimulation. During stimulation, due to the injection, even a non-optimally oriented
439 fault may experience shear slip in addition to optimally oriented faults. Thus, the pore pressure
440 migrates an optimally oriented fault that is more permeable and a non-optimally oriented, less
441 permeable fault. As such, during the stimulation, the MS cloud reflected all microseismic events
442 from those faults, and we observed the permeability tensor under dynamically pressurized
443 conditions. Therefore, we refer to this dynamic permeability tensor. Following stimulation or
444 shut-in, despite the occurrence of a very dynamic pore pressure re-distribution process associated
445 with shut-in over a few days (Mukuhira et al., 2017), the pore pressure relaxation occurs with
446 inherent reservoir permeability because of the disappearance of the pressure source. Pore
447 pressure migrates along naturally permeable fractures that are optimally oriented, and the most
448 permeable faults.

449 4.2 MS cloud growth controlled by *in-situ* stress

450 Throughout the PCA and based on several observations, we found that the MS cloud
451 shape was significantly correlated with *in-situ* stress. From the 3D MS cloud growth observation,
452 the MS cloud extension did not always occur in the maximum principal stress direction. Rather,
453 it occurred in the plane perpendicular to the minimum principal stress (S_{hmin}). It is difficult to
454 perceive the 3D growth of the MS cloud for human inspection; however, we discovered that MS
455 cloud growth occurred in the direction influenced by maximum and intermediate principal stress.
456 Previously, the MS cloud was considered to extend in the maximum principal stress direction.
457 Although this is correct the insights from this study show that the MS cloud does not extend
458 exactly to the maximum principal stress, rather, it extends in the plane defined by the maximum
459 and intermediate principal stress, keeping the balance of maximum and intermediate stress. The
460 influence of intermediate stress could not be ignored. Throughout our study period, the third
461 PCA component was constantly oriented in the S_{hmin} direction (Figures 4(c) and 5(c)), regardless
462 of the scale change of the MS cloud over time. This suggests that MS cloud growth behavior in
463 this field is a scale-independent process, and indicates the homogeneity of *in-situ* stress in the
464 reservoir.

465 From the depth sectional PCA analysis (Figures 6 and 7), the MS cloud extension
466 orientation was more or less constant and consistent with the orientation of S_{Hmax} despite the
467 influence of various existing faults in each depth section (Figure S3). The 2D aspect ratios at
468 each depth were also stable and showed similar values to the horizontal stress ratio, with the
469 exception at shallower depths (~4300 m). Most MS events at shallower depths occurred after the
470 shut-in (Figure 2). A tiny perturbation of pore pressure triggered these events, such that the
471 delineated MS cloud was the optimally oriented fracture that presented a higher aspect ratio.
472 Thus, the shape of the MS cloud is also influenced by pore pressure migration.

473 Observations from the injection depth section further support this observed tendency. The
474 orientation of the MS cloud was stable and the same as that of S_{Hmax} . The MS cloud shape was
475 more linear during the early stage of stimulation as the pore pressure remained low, and
476 optimally oriented faults were able to fail. Then, the MS cloud shape became more elliptical with
477 time; i.e., pore pressure increase, because the non-optimally oriented fault could fail. Figure 9(d)
478 shows a clear tendency that the aspect ratio of the MS cloud decreases with time (i.e., pore
479 pressure). We conducted this analysis in the injection depth section, assuming that pore pressure
480 in this depth section can become as high as wellhead pressure; a very strong pressure gradient in
481 this section was not expected.

482 Time series observations on the cross-sectional MS cloud growth provides further
483 evidence of the MS cloud growth dependence on *in-situ* stress. S_{Hmax} and S_v are the principal
484 stressors working on this cross-section, and their stress magnitudes were very similar such that
485 the stress regime transition occurs. The MS cloud aspect ratio was between 1.0 and 1.4, similar
486 to the stress ratio between S_{Hmax} and S_v . The aspect ratio of the MS cloud did not change
487 significantly compared to other aspect ratio observations. These observations suggest that pore
488 pressure along this plane migrated radially, resulting in a circular MS cloud.

489 Thus, we found that MS cloud shape in our research field was mainly controlled by *in-*
490 *situ* stress from the macroscopic perspective. Locally, the pore pressure perturbation or existing
491 fracture affects the MS cloud shape, although this shape may be scaled with the principal stress
492 ratio. We have not interpreted all of these local interactions as it was not easy to link to all
493 physical processes associated with MS activity and *in-situ* stress, e.g., multiplet cluster analysis
494 shown in Figure S5 or S8 is not very informative for our purpose due to its complexity.
495 However, our analysis results reasonably imply the scaling relationship between MS cloud shape
496 and *in-situ* stress. In this field, there were also various natural fractures from borehole logging
497 analysis (Ziegler & Evans, 2015). Some of these fractures were connected to fractures delineated
498 by microseismic analysis (Ziegler & Evans, 2020). Some existing fractures were orientated to
499 that of the S_{hmin} . Therefore, it is likely that there was some flow path to the orientation of S_{hmin} .
500 However, the extension of the MS cloud to the orientation of S_{hmin} was insignificant. These faults
501 should not be very permeable due to high normal stress working on those fractures perpendicular
502 to S_{Hmax} . Therefore, we conclude that *in-situ* stress plays a primary role in controlling the MS
503 cloud growth associated with pore pressure migration. This is achieved by controlling the
504 permeability and shear failure of each existing fracture in a fractured reservoir that hosts a wide
505 variety of existing fractures.

506 4.3 Comparison with other EGS field

507 In this section we discuss how the insights derived from this study may explain the MS
508 cloud growth in other EGS fields. We select a number of the cases of EGS and HDR projects and
509 review the MS cloud growth features by comparing the *in-situ* stress information based on
510 published literature. The reliability of microseismic and *in-situ* stress information is very site
511 dependent, and the project year also impacts reliability based on the technologies available at
512 that time.

513 4.3.1 Soultz-sous-Forêts, France

514 Hydraulic fracturing was conducted at GPK-1 in the Soultz-sous-Forêts HDR field,
515 located in the Rhine graben with a basement of Soultz granite having intruded the Devonian-
516 Early Carboniferous rocks. For 20 d in 1993, ~45,000 m³ of freshwater was injected into granite.
517 This was done at depths between 2.8 and 3.4 km with a maximum wellhead pressure of 10 MPa,
518 whilst the flow rate was increased to 50 L/s (Baria et al., 1999; Moriya et al., 2002). The
519 subvertical cloud of microseismicity that was 0.5 km wide, 1.2 km long, 1.5 km high and
520 oriented N25°W was produced (Evans et al., 2005).

521 The orientation of the maximum principal horizontal stress, S_{Hmax} , obtained from
522 thermally induced tension fractures in borehole GPK-1, was relatively well determined as
523 N170°E ± 15° (Evans et al., 2005). The magnitudes of the maximum and intermediate principal
524 stresses also shared similar values. The maximum principal stress direction was replaced from
525 the horizontal direction to the vertical direction at a depth of approximately 2900 m, suggesting
526 the closeness of S_{Hmax} and S_v . The minimum principal stress direction was estimated to be
527 approximately N65°E.

528 The orientation of natural fractures detected by the UBI log run in GPK-1 indicates the
529 dominance of subvertical fractures with strike of N-S. On the other hand, the MS cloud had the
530 principal direction on the plane perpendicular to the minimum principal stress direction (N65°E).
531 This implies that the shape and principal direction of the MS cloud were subject to tectonic stress
532 as opposed to the orientation of natural fractures. These observations support the findings of this
533 study, possibly because Soultz and Basel are within a similar tectonic setting.

534 4.3.2 Cooper Basin, Australia

535 First fluid injections were conducted in 2003 to create hot fractured rock geothermal
536 reservoirs (Baisch et al., 2006). A total of 20,000 m³ of fluid was injected into granite at 4250 m.
537 More than 11,000 microseismic events delineated the sub-horizontal structure of the reservoir.
538 The geometry of the MS cloud was 2 × 1.5 km in the horizontal direction and 150–200 m
539 thickness. Horizontal MS cloud grew in the NNE-SSW direction. The reservoir consisted only of
540 single or sub-parallel existing fractures based on the microseismicity and logging data (Baisch et
541 al., 2006). The stress state was estimated to be the reverse fault regime, consistent with the
542 overall MS cloud shape. However, the orientation of S_{Hmax} was N110°E (Reynolds et al., 2005),
543 and this was not consistent with the orientation of MS cloud growth. The width of the MS cloud
544 was significantly smaller than that of the horizontal extension, although detailed *in-situ* stress
545 magnitude information was unavailable.

546 These observations were not always consistent with the insights of this study. However,
547 the Cooper Basin may be interpreted as an extreme case of the site-specific condition of a very
548 selective horizontal existing fracture; the existing fracture-dominated process. Therefore, in a

549 field dominated by strongly preferred existing fractures, the insights from this study would be
550 ineffective, as would the *in-situ* stress effect.

551 4.3.3 Fenton hill, United States

552 The massive hydraulic fracture treatment (MHF) on Well EE-2 was performed in 1983 as
553 known as Expt. 2032. Roughly 21,000 m³ of water was injected at around 3.6 km depth. The
554 maximum flow rate of 109 kg/s and maximum wellhead pressure of 4.9 MPa were recorded
555 (Brown et al., 2012). MS cloud during MHF extended to NNW-SSE according to recent
556 compiling work (Norbeck et al., 2018), despite the orientation of S_{Hmax} of N30°E. So, MS
557 cloud growth of this field already showed unique behavior, which is different from the findings
558 of this study, even though this is the first pilot project of EGS. The result of the wellhead
559 pressure values of several pre-stimulations and focal mechanism leads to the orientation of
560 dominant fracture sets as NNW-SSE (Norbeck et al., 2018). So, the MS cloud growth behavior
561 was controlled by a more existing fracture set rather than *in-situ* stress. The *in-situ* stress
562 magnitude information still has a room for investigation, injection pressure exceeded the
563 minimum principal stress, but still, MS cloud extended to a different direction to the maximum
564 principal stress. Numerical experiment results suggest that the tensile-shear mixed mechanism
565 and the existing fracture distribution played important role in the Fenton hill reservoir (Norbeck
566 et al., 2018).

567 4.3.4 Desert Peak, United States

568 Desert peak is located in Hot Springs Mountain, Nevada, in the United States. Ormat
569 Nevada Inc. conducted an enhanced geothermal systems project supported by DOE. In this
570 project, multi-phased stimulations were conducted between 2010 and 2011 (Zemach et al.,
571 2017). These stimulations were composed of hydroshearing (injection pressure $< S_{hmin}$),
572 chemical fracking, and hydrofracking (injection pressure $> S_{hmin}$). The stimulation target was
573 approximately 1000 m deep (Lutz et al., 2009). Microseismic events were mainly triggered
574 during the hydrofracking phase, and formed a subvertical tabular shaped cloud based on the
575 seismic event list in Zemach et al. (2017). The major and minor axes of the tabular cloud were
576 ~1 km and corresponded to the S_v and S_{Hmax} directions (Davatzes & Hickman, 2009),
577 respectively. The thickness direction of the tabular cloud was 0.2 km, along the S_{hmin} direction of
578 the normal fault stress regime (Davatzes & Hickman, 2009). The stress magnitude at a depth of
579 930 m was estimated to be 22.6 MPa (S_v), 18.2–22.6 MPa (S_{Hmax}) and 13.8 MPa (S_{hmin})
580 (Hickman & Davatzes, 2010). The aspect ratios of the MS cloud and stress ratio were 1:1:0.2 and
581 1:0.8–1: 0.6, respectively. The MS cloud direction and aspect ratio were consistent with those of
582 *in-situ* stress, consistent with the findings in this paper, although microseismic events occurred
583 under hydrofracking conditions.

584 4.3.5 Pohang, South Korea

585 Pohang is located in the southeastern area of South Korea. The Pohang EGS project was
586 terminated with the Pohang earthquake (Mw 5.5) on November 15, 2017 (Korean Government
587 Commission, 2019; Ellsworth et al., 2019). Injection was conducted using two wells (PX-1 and
588 PX-2) that were separated by several hundred meters. Injection from PX-2 seemed to induce the
589 Pohang earthquake. Prior to the mainshock, the MS cloud around the injection point of PX-2
590 formed a tabular shape (strike N214°E, dipping 43°). On the other hand, the direction of *in-situ*
591 S_{Hmax} was N77°E; this did not exactly correspond with the strike of the MS cloud. The lengths of
592 the MS cloud along strike, dip and width directions were 1, 0.5 and 0.2 km, respectively based

593 on the hypocenter location (Korean Government Commission, 2019; Ellsworth et al., 2019). The
 594 estimated stress magnitude at a 4.2 km depth was $S_{Hmax} = 243$ MPa, $S_{hmin} = 120$ MPa, and $S_v =$
 595 106 MPa, suggesting normal faulting stress regime (Korean Government Commission, 2019;
 596 Ellsworth et al., 2019). Therefore, the shape of the MS cloud did not agree with the *in-situ* stress
 597 ratio. The MS cloud may have selectively occurred on an unknown fault, in turn triggering the
 598 mainshock (Korean Government Commission, 2019; Ellsworth et al., 2019).

599 4.3.6 Helsinki, Finland

600 In an EGS project in Helsinki, Finland, the first pilot stimulation was conducted at the
 601 OTN-3 well by St-1 Deep Heat Oy in 2018 (Kwiatek et al., 2019). They targeted the granitic
 602 formation at a true vertical depth of 5.7 to 6.1 km. At this depth, the principal stress magnitudes
 603 were estimated to be approximately $S_{hmin} = 110$ MPa, $S_v = 180$ MPa, and $S_{Hmax} = 240$ MPa. The
 604 pore pressure was assumed to be hydrostatic, and approximately 60 MPa, suggesting a critical
 605 stress state for shear slip occurrence at optimally oriented fractures.

606 The microseismicity of 1977 events was relocated by a relative location technique
 607 (Kwiatek et al., 2019). The hypocenter distribution delineated some spatially separated clusters
 608 in the vicinity of individual sections of multi-stage stimulation. The NW–SE trending
 609 macroscopic horizontal extension of each cluster was subparallel to the axis of the current local
 610 S_{Hmax} (N110°E). The majority of microseismicity was determined in a cluster around the bottom
 611 hole regardless of the active injection stage, due to the packer leak. This largest hypocenter
 612 cluster exhibited a plane-like shape dipping to the NE. Although the causes of this oblique
 613 hypocenter distribution were not revealed, the plane like flat shape of the hypocenter distribution
 614 possibly corresponds to an anisotropic stress ratio. The hypocenter clusters located in the
 615 shallower depth range from 4900–5900 m showed a horizontally linear shape with a horizontal
 616 aspect ratio of 1:3 (visually measured); this was consistent with the anisotropic horizontal stress
 617 ratio.

618 4.3.7 Hijiori, Japan

619 Following nearly aseismic first hydraulic fracturing in 1986, the second hydraulic
 620 stimulation that induced 65 events, in the third case, approximately 2115 m³ of freshwater was
 621 injected into HDR-1 at a depth of 2.3 km in 1992 (Sasaki and Kaieda, 2002). Then, the source
 622 locations of 127 events were determined. The MS cloud shows several planar features; strike in
 623 the E-W direction, dipping in N direction. The lengths of the MS cloud along the strike, dip, and
 624 width directions were 0.5, 0.5, and 0.2 km, respectively (Tezuka and Niitsuma, 2000; Sasaki and
 625 Kaieda, 2002). The estimated stress magnitude at 2.2 km depth was $S_{Hmax} = 64.8$ MPa (E-W),
 626 $S_{hmin} = 39.4$ MPa (N-S), and $S_v = 45$ MPa (Oikawa and Yamaguchi, 2000). The principle
 627 direction of the MS cloud agreed with the S_{Hmax} direction, where the aspect ratios of the MS
 628 cloud and the stress ratio were 1:1:0.4 and 1:0.61:0.69 (p_{hyd} deducted), respectively.

629 The MS cloud direction was correlated to *in-situ* stress to a certain extent, although their
 630 aspect ratios were not correlated to *in-situ* stress ratio fully. Note that the number of
 631 microseismic events was significantly small compared to other cases, regardless of the moderate
 632 wellhead pressure of 26 MPa for third hydraulic fracturing.

633 4.3.8 Ogachi, Japan

634 Hydraulic fracturing was conducted at OGC-1 in the Ogachi HDR field in Japan.
 635 Approximately 10,140 m³ of freshwater was injected into granodiorite between 0.99 and 1.0 km

636 depth in 1991. Then, approximately 5440 m³ of freshwater was injected between 0.71 and 0.72
 637 km depth in 1992 (Kaieda et al., 1992; Hori et al., 1994; Kaieda et al., 2010). During the first
 638 hydraulic fracturing, the source locations of 1554 events were determined, and an MS cloud that
 639 was 0.2 km wide, 1 km long, 0.5 m high, and oriented N20°E was produced. In the second
 640 hydraulic fracturing, the source locations of ~1000 events were determined, with an MS cloud
 641 that was 0.2 km wide, 0.8 km long, 0.4 km high, and oriented N100°E (Hori et al., 1994). The
 642 estimated stress magnitude at a 0.99~1.0 km was $S_{Hmax} = 25$ MPa (E-W), $S_{hmin} = 22$ MPa, and S_v
 643 = 25 MPa. This suggests a reverse or strike-slip faulting stress regime. The magnitudes of S_{hmin}
 644 and S_v shared similar values, and their size relation is likely to be interchanged (Shin et al.,
 645 2000).

646 During the first hydraulic fracturing, the principal direction of the MS cloud did not agree
 647 with the S_{Hmax} direction (E-W). This suggests that the shape of the MS cloud growth was
 648 potentially controlled by pre-existing fractures as opposed to tectonic stress. In the second
 649 hydraulic fracturing, the principal direction of the MS cloud agreed with the maximum principal
 650 stress direction, although the aspect ratios of the MS cloud and stress ratios were 1:0.5:0.25 and
 651 1:0.6:0.5, respectively. The MS cloud direction and aspect ratio were correlated to those of *in-*
 652 *situ* stress to a certain extent, although the MS cloud extended to the direction of the minimum
 653 principal stress compared to the forecasted *in-situ* stress.

654 5 Conclusions

655 This study precisely investigated how microseismic clouds grow during hydraulic
 656 stimulation by applying PCA to a time series of microseismic hypocenter distribution. PCA
 657 derived the orientation of MS cloud growth both quantitatively and statistically. The MS cloud
 658 behavior characterized by PCA in several aspects was compared and discussed as it relates to *in-*
 659 *situ* stress information.

660 The main conclusions of this study were:

- 661 • The MS cloud growth behavior differed during and after stimulation, corresponding to
 662 the dynamic and static permeability tensor of the reservoir. During stimulation, the MS
 663 cloud shape changed with an increase in pore pressure, controlled by the *in-situ* stress. In
 664 post-stimulation, the MS cloud extended along the optimally oriented fractures, which
 665 were the most permeable;
- 666 • The MS cloud shape and its aspect ratio defined in the horizontal or cross-sectional
 667 direction matched very well with the effective stress ratio on that plane. The MS cloud
 668 from different depth sections showed a close aspect ratio to the effective horizontal stress
 669 ratio. Depth section and cross-sectional MS cloud along the orientation of S_{Hmax} was
 670 circular, reflecting the very close stress magnitude of S_{Hmax} and S_v ;
- 671 • Insights from this study were compared to MS cloud shapes from different EGS fields.
 672 Many of the fields showed satisfiable consistency between MS cloud shape and *in-situ*
 673 stress.

674 We conclude that MS cloud shape is mainly controlled by *in-situ* stress, particularly in
 675 where various existing fractures exist, such as was the case in Basel. This study has advanced the
 676 understanding of the reservoir creation process. There are still knowledge gaps that need to be
 677 addressed for a complete understanding of the reservoir creation process. These include

678 understand how the MS cloud shape may be roughly scaled by the stress ratio. The findings from
679 this study also emphasize the importance of reliable stress measurements that provide more
680 meaningful information on the reservoir creation process.

681 **Acknowledgments, Samples, and Data**

682 All authors are not aware of any conflicts of interest. We thank N. Watanabe for
683 discussions and comments on the manuscript. This study is supported by an R&D project for
684 super-critical geothermal field development supported by NEDO. Part of the work was carried
685 out under the Collaborative Research Project of the Institute of Fluid Science, Tohoku
686 University.

687 **Data Availability Statement**

688 The microseismic catalog data containing the location, magnitude, and cluster information is
689 uploaded to the MIT institutional repository associated with submission of another paper (under
690 review) to AGU journal. Meanwhile, data are temporarily available in the Supporting
691 Information.

692

693 **References**

- 694 Asanuma, H., Kumano, Y., Hotta, A., Niitsuma, H., Schanz, U., & Häring, M. (2007), Analysis
695 of microseismic events from a stimulation at Basel, Switzerland, *GRC Transactions*, *31*, 265–
696 270.
- 697 Asanuma, H., Kumano, Y., Niitsuma, H., Schanz, U., & Häring, M. (2008). Interpretation of
698 Reservoir Structure from Super-Resolution Mapping of Microseismic Multiplets from
699 Stimulation at Basel, Switzerland in 2006, *Proceedings of the World Geothermal Congress*.
- 700 Baisch, S., Weidler, R., Vörös, R., Wyborn, D., & de Graaf, L. (2006). Induced seismicity during
701 the stimulation of a geothermal HFR reservoir in the Cooper Basin, Australia. *Bulletin of the*
702 *Seismological Society of America*, *96*(6), 2242–2256. <https://doi.org/10.1785/0120050255>.
- 703 Baria, R., Baumgärtner, J., Gérard, A., Jung, R., & Garnish, J. (1999). European HDR research
704 programme at Soultz-sous-Forêts (France) 1987-1996. *Geothermics*, *28*(4–5), 655–669.
705 doi:10.1016/S0375-6505(99)00036-X.
- 706 Brown, D., Duchane, D., Heiken, G., Hriscu, V. (2012). Mining the Earth's Heat: Hot Dry Rock
707 Geothermal Energy. Springer.
- 708 Davatzes, N., & Hickman, H. (2009). Fracture, stress and fluid flow prior to stimulation of well
709 27-15, Desert Peak, Nevada, EGS project, *Proceedings of the 34th Workshop on Geothermal*
710 *Reservoir Engineering*, Stanford, CA.
- 711 Dyer, B. C., Schanz, U., Ladner, F., Häring, M. O., & Spillman, T. (2008). Microseismic
712 imaging of a geothermal reservoir stimulation. *The Leading Edge*, *27*(7), 856. doi:
713 10.1190/1.2954024.
- 714 Dyer, B. C., Schanz, U., Spillmann, T., Ladner, F., & Häring, M. O. (2010). Application of
715 microseismic multiplet analysis to the Basel geothermal reservoir stimulation events.
716 *Geophysical Prospecting*, *58*(5), 791–807. doi:10.1111/j.1365-2478.2010.00902.x.

- 717 Ellsworth, W. L., Giardini, D., Townend, J., Ge, S., & Shimamoto, T. (2019). Triggering of the
718 Pohang, Korea, earthquake (Mw 5.5) by enhanced geothermal system stimulation, *Seismological*
719 *Research Letters*, *90*, 1844–1858.
- 720 Evans, K. F., Moriya, H., Niitsuma, H., Jones, R. H., Phillips, W. S., Genter, A., et al. (2005).
721 Microseismicity and permeability enhancement of hydrogeologic structures during massive fluid
722 injections into granite at 3 km depth at the Soultz HDR site. *Geophysical Journal International*,
723 *160*(1), 388–412. doi:10.1111/j.1365-246X.2004.02474.x.
- 724 Häring, M. O., Schanz, U., Ladner, F., & Dyer, B. C. (2008). Characterisation of the Basel 1
725 enhanced geothermal system. *Geothermics*, *37*(5), 469–495. doi:
726 10.1016/j.geothermics.2008.06.002.
- 727 Herrmann, M., Kraft, T., Tormann, T., Scarabello, L., & Wiemer, S. (2019). A Consistent High-
728 Resolution Catalog of Induced Seismicity in Basel Based on Matched Filter Detection and
729 Tailored Post-Processing. *Journal of Geophysical Research: Solid Earth*, *124*(8), 8449–8477.
730 doi:10.1029/2019JB017468.
- 731 Hickman, S., & Davatzes, N. C. (2010). In-situ stress and fracture characterization for planning
732 of an EGS stimulation in the Desert Peak Geothermal Field, Nevada, *Proceedings of the 35th*
733 *Workshop on Geothermal Reservoir Engineering*, Stanford, CA.
- 734 Hill, D. P. (1977). A model for earthquake swarms. *Journal of Geophysical Research*, *82*(8),
735 1347. doi:10.1029/JB082i008p01347.
- 736 Hori, Y., Kitano, K., & Kaieda. (1994). Outline of Ogachi project for HDR geothermal power in
737 Japan, *Transactions of the Geothermal Resources Council*, *18*, 439–443.
- 738 Kaieda, H. et. al. (1992). Ogachi project for HDR geothermal power in Japan first hydraulic
739 fracturing results, *Transactions of the Geothermal Resources Council*, *16*, 493–496.
- 740 Kaieda, H., Sasaki, S., & Wyborn, D. (2010). Comparison of characteristics of microearthquakes
741 observed during hydraulic stimulation operations in Ogachi, Hijiori and Cooper Basin HDR
742 projects, *Proceedings of the World Geothermal Congress*.
- 743 Korean Government Commission. (2019). Summary report of the Korean Government
744 Commission on relations between the 2017 Pohang Earthquake and EGS Project, Geological
745 Society of Korea, Seoul, South Korea, doi: 10.22719/KETEP-20183010111860.
- 746 Kwiatek, G., Saarno, T., Ader, T., Bluemle, F., Bohnhoff, M., Chendorain, M., et al. (2019).
747 Controlling fluid-induced seismicity during a 6.1-km-deep geothermal stimulation in Finland.
748 *Science Advances*, *5*(5), 1–12. doi: 10.1126/sciadv.aav7224.
- 749 Lutz, S. J., Hickman, S., Davatzes, N., Zemach, E., Drakos, P., & Robertson-Tait, A. (2010).
750 Rock Mechanical Testing and Petrologic Analysis in Support of Well Stimulation Activities at
751 the Desert Peak Geothermal Field, Nevada. *Proceedings of the 35th Workshop on Geothermal*
752 *Reservoir Engineering*, Stanford, CA.
- 753 Moriya, H., Niitsuma, H., & Baria, R. (2003). Multiplet-Clustering Analysis Reveals Structural
754 Details within the Seismic. *Bulletin of the Seismological Society of America*, *93*(4), 1606–1620.
755 doi:10.1785/0120020072.

- 756 Moriya, Hirokazo, Nakazato, K., Niitsuma, H., & Baria, R. (2002). Detailed fracture system of
757 the Soultz-sous-Forêts HDR field evaluated using microseismic multiplet analysis. *Pure and*
758 *Applied Geophysics*, *159*(1–3), 517–541. doi:10.1007/PL00001263.
- 759 Mukuhira, Y., Dinske, C., Asanuma, H., Ito, T., & Häring, M. O. (2017). Pore pressure behavior
760 at the shut-in phase and causality of large induced seismicity at Basel, Switzerland. *Journal of*
761 *Geophysical Research: Solid Earth*, *122*(1), 411–435. doi:10.1002/2016JB013338.
- 762 Mukuhira, Y., Fuse, K., Naoi, M., Fehler, M. C., Moriya, H., Ito, T., et al. (2018). Hybrid focal
763 mechanism determination: Constraining focal mechanisms of injection induced seismicity using
764 in situ stress data. *Geophysical Journal International*, *215*(2), 1427–1441.
765 doi:10.1093/GJI/GGY333.
- 766 Mukuhira, Yusuke, Asanuma, H., Niitsuma, H., & Häring, M. O. (2013). Characteristics of
767 large-magnitude microseismic events recorded during and after stimulation of a geothermal
768 reservoir at Basel, Switzerland. *Geothermics*, *45*, 1–17. doi:10.1016/j.geothermics.2012.07.005.
- 769 Mukuhira, Yusuke, Moriya, H., Ito, T., Asanuma, H., & Häring, M. (2017). Pore pressure
770 migration during hydraulic stimulation due to permeability enhancement by low-pressure
771 subcritical fracture slip. *Geophysical Research Letters*, *44*(7), 3109–3118.
772 doi:10.1002/2017GL072809.
- 773 Norbeck, J. H., McClure, M. W., & Horne, R. N. (2018). Field observations at the Fenton Hill
774 enhanced geothermal system test site support mixed-mechanism stimulation. *Geothermics*,
775 *74*(March), 135–149. doi:10.1016/j.geothermics.2018.03.003.
- 776 Oikawa, Y. & Yamaguchi, T. (2000). Stress measurement using rock core in an HDR field,
777 *Proceedings of the World Geothermal Congress*, 3819–3822..
- 778 Pine, R. J., & Batchelor, A. S. (1984). Downward migration of shearing in jointed rock during
779 hydraulic injections. *International Journal of Rock Mechanics and Mining Sciences &*
780 *Geomechanics Abstracts*, *21*(5), 249–263. doi:10.1016/0148-9062(84)92681-0.
- 781 Reynolds, S. D., S. D. Mildren, R. R. Hillis, J. J. Meyer, and T. Flottmann (2005). Maximum
782 horizontal stress orientations in the Cooper Basin, Australia: Implications for plate-scale
783 tectonics and local stress sources, *Geophys. J. Int.* *160*, 331–343.
- 784 Sasaki, S., & Kaieda, H. (2002). Observation and Analysis of AE Events Accompanying
785 Hydraulic Injection at the Hijiori Hot Dry Rock Site, *Journal of the Geothermal Research*
786 *Society of Japan*, *24*(3), 245–265.
- 787 Shapiro, S. A., Audigane, P., & Royer, J. J. (1999). Large-scale in situ permeability tensor of
788 rocks from induced microseismicity. *Geophysical Journal International*, *137*(1), 207–213.
789 doi:10.1046/j.1365-246X.1999.00781.x.
- 790 Shin, K., Ito, H., & Oikawa, Y. (2000). Stress state at the Ogachi site, *Proceedings World*
791 *Geothermal Congress*, 1749–1752.
- 792 Sibson, R. H. (1996). Structural permeability of fluid-driven fault-fracture meshes. *Journal of*
793 *Structural Geology*, *18*(8), 1031–1042. doi:10.1016/0191-8141(96)00032-6.
- 794 Soma, N., Niitsuma, H., & Baria, R. (2007). Reflection imaging of deep reservoir structure based
795 on three-dimensional hodogram analysis of multicomponent microseismic waveforms. *Journal*
796 *of Geophysical Research: Solid Earth*, *112*(11), 1–14. doi:10.1029/2005JB004216.

- 797 Tezuka, K & Niitsuma, H. (2000). Stress estimated using microseismic clusters and its
 798 relationship to the fracture system of the Hijiori hot dry rock reservoir, *Engineering Geology*, 56,
 799 47–62.
- 800 Valley, B., & Evans, K. F. (2009). Stress orientation to 5 km depth in the basement below Basel
 801 (Switzerland) from borehole failure analysis. *Swiss Journal of Geosciences*, 102(3), 467–480.
 802 doi:10.1007/s00015-009-1335-z.
- 803 Valley, B., & Evans, K. F. (2015). Estimation of the Stress Magnitudes in Basel Enhanced
 804 Geothermal System. *World Geothermal Congress 2015*, (April), 12.
- 805 Valley, B., & Evans, K. F. (2019). Stress magnitudes in the Basel enhanced geothermal system.
 806 *International Journal of Rock Mechanics and Mining Sciences*, 118(November 2018), 1–20.
 807 doi:10.1016/j.ijrmms.2019.03.008.
- 808 Waldhauser, F., & Ellsworth, W. L. (2000). A Double-difference Earthquake location algorithm:
 809 Method and application to the Northern Hayward Fault, California. *Bulletin of the Seismological
 810 Society of America*, 90(6), 1353–1368. doi:10.1785/0120000006.
- 811 Watanabe, N., Hirano, N., & Tsuchiya, N. (2008). Determination of aperture structure and fluid
 812 flow in a rock fracture by high-resolution numerical modeling on the basis of a flow-through
 813 experiment under confining pressure. *Water Resources Research*, 44(6), 1–11.
 814 doi:10.1029/2006WR005411.
- 815 Yeo, I. W., De Freitas, M. H., & Zimmerman, R. W. (1998). Effect of shear displacement on the
 816 aperture and permeability of a rock fracture. *International Journal of Rock Mechanics and
 817 Mining Sciences*, 35(8), 1051–1070. doi:10.1016/S0148-9062(98)00165-X.
- 818 Zemach, E., Drakos, P., Spielman, P., & Akerley, J. (2013). Desert Peak Enhanced Geothermal
 819 Systems (EGS) Project (Draft Final Report), doi:10.2172/1373310.
- 820 Ziegler, M., Valley, B., & Evans, K.F. (2015). Characterisation of natural fractures and fracture
 821 zones of the Basel EGS reservoir inferred from geophysical logging of the Basel-1 well.
 822 *Proceedings of the World Geothermal Congress*, Melbourne, Australia, pp. 19–25. April, 12.
- 823 Ziegler, M., & Evans, K. F. (2020). Comparative study of Basel EGS reservoir faults inferred
 824 from analysis of microseismic cluster datasets with fracture zones obtained from well log
 825 analysis. *Journal of Structural Geology*, 130(October 2019), 103923.
 826 doi:10.1016/j.jsg.2019.103923.
- 827 Zoback, M. (2007). *Reservoir Geomechanics*, Cambridge University Press.
 828