

Surface Deformation and Seismicity Induced by Poroelastic Stress at the Raft River Geothermal Field, Idaho, USA

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Abstract

We investigate the relative importance of injection and production on the spatial-temporal distribution of induced seismicity at the Raft River geothermal field. We use time-series of inSAR measurements to document surface deformation and calibrate a hydro-mechanical model to estimate effective stress changes imparted by injection and production. Seismicity, located predominantly in the basement, is induced primarily by poroelastic stresses from cold water reinjection into a shallower reservoir. The poroelastic effect of production from a deeper reservoir is minimal and inconsistent with observed seismicity, as is pore-pressure-diffusion in the basement and along reactivated faults. We estimate an initial strength excess of 20kPa in the basement and sedimentary cover, but the seismicity rate in the sedimentary cover is 4 times lower, reflecting lower density of seed-points for earthquake nucleation. Our modeling workflow could be used to assess the impact of fluid extraction or injection on seismicity and help design or guide operations.

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Key Points

- A hydro-mechanical model of effective stress changes from injection and production is calibrated using surface deformation from InSAR
- Seismicity, located predominantly in the basement, is primarily induced by poroelastic stress changes from cold water re-injection
- Similar stress changes trigger 4 time more earthquakes per unit volume in the basement than in the sedimentary cover.

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25 initial strength excess of $\sim 20\text{kPa}$ in the basement and sedimentary cover, but the seismicity rate in the
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29 Plain Language Summary

30 It is important to understand the mechanisms behind human-induced earthquakes, whether they are
31 beneficial in the context of generating fractures for effective geothermal energy systems, or hazardous
32 in the case of large earthquakes that may cause structural damage. Here, we present a case study of the
33 Raft Rive geothermal field, which has operated since 2007 and generated earthquakes since 2010. Our
34 objective is to understand how hot water, which is extracted from a deep sedimentary layer, and cold
35 water, which is injected into a shallower layer, contribute to the observed seismicity, which have
36 primarily occurred underneath the extraction layer. We construct a model to determine how the
37 injection and extraction affect underground fluid pressures, and how these pressures impart stresses
38 throughout the subsurface. This model is calibrated using InSAR, a satellite-based technique which

provides precise measurements the Earth's surface deformation in time. The results show that the shallow cold water injection is main culprit behind the deep earthquakes, because of the stresses imparted by the fluid pressure increase, whereas the effects of the deep extraction is negligible. Our modeling workflow could be used to assess the impact of fluid extraction or injection on seismicity and help guide operations.

1 Introduction

Injection and extraction of fluids from the subsurface can induce earthquakes (e.g., Ellsworth, 2013). Induced seismicity can be intentional and beneficial. This is the case in the context of Enhanced Geothermal Systems where hydrofractures and shear-fractures are used to enhance permeability (Elsworth et al., 2016). In the context of CO₂ storage, fracturing of the underburden, the rock volume beneath the target reservoir, could enhance the storage capacity. Most commonly though, seismicity is viewed as a source of hazard that can compromise the safe operation of a geothermal field or of a CO₂ storage site (Zoback and Gorelick, 2012; Ellsworth et al., 2016). In any case, there is much need for a better understanding of how such operations could induce earthquakes.

It is well established that the Coulomb Failure Stress change, ΔCFS , can be used to assess the risk of induced seismicity due to a stress change at a particular location (King et al., 1994; Stein, 1999). An increase of ΔCFS can in principle result from an increase of shear stress, an increase of pore pressure, or decrease of normal stress. In the case of fluid injection or extraction, ΔCFS at a given location might be due to pore pressure diffusion or due to thermo- or poroelastic stress changes (e.g., Segall et al., 1994; Segall and Fitzgerald, 1998; Goebel and Brodsky, 2018). The effect of pressure diffusion might, in principle, be identified from the migration pattern of seismicity (e.g., Shapiro et al., 1997). By contrast, poroelastic stresses due to a well operation are imparted almost instantaneously and should result in a spatially stationary pattern which can reach large distances shortly after injection (Goebel et al, 2017;

Zhai and Shirzaei, 2019). In reality, disentangling the relative role of these mechanisms is often challenging. One reason is that the temporal evolution of seismicity also depends on the earthquake nucleation process, so that it does not reflect instantaneous stress changes (*e.g.*, Dieterich, 1994; Zhai and Shirzaei, 2019; Alghannam and Juanes, 2020). Another reason is that field operations often involve a complex set of injecting and extracting wells (*e.g.*, Hornbach et al., 2015); assigning seismicity to particular sources of stresses is therefore often ambiguous in such a context.

Here we study the case-example of seismicity induced at the Raft River geothermal field, which is particularly appropriate to gain insight into induced earthquake triggering mechanisms (Figure 1). The number of wells is relatively small and the geological setting is simple and well documented (*e.g.*, Bradford et al., 2013; Nash and Moore, 2012). In addition, a prominent geodetic signal has been previously observed using Synthetic Aperture Radar Interferometry, InSAR (Liu et al., 2018; Ali et al., 2018). Such measurements can indeed provide important constraints on the spatio-temporal evolution of the pressure field and fluid flow in the sub-surface reservoirs (Ali et al., 2018, Hoffmann et al., 2001; Chaussard et al., 2014). Finally, and most importantly for the purpose of this study, local seismic monitoring has revealed seismicity clearly correlated with the geothermal field (Figure 1a). One interesting specific feature of the Raft River geothermal field is that hot water is produced from a ~100m thick reservoir at a depth of ~1500m below surface, and the cold water is reinjected in a distinct ~300m thick shallower reservoir at 500m depth below surface.

Given that the production reservoir directly overlies the seismogenic basement, it is unlikely that pore pressure diffusion into the basement is responsible for the observed seismicity. If the zone of seismicity were hydraulically connected to the reservoir, fluid extraction should have decreased the pore pressure, leading to fault strengthening. As a result, the thermo- and poroelastic contributions from production and injection are perhaps the primary mechanisms behind the induced seismicity. Hereafter, we first

give an overview of the setting of the Raft River geothermal field. We next present the methods used to model surface deformation and effective stress changes in the sub-surface. In the results section, we investigate the relative importance of injection and production on the spatial and temporal distribution of induced seismicity.

2 Setting of the Raft River Geothermal field

The Raft River geothermal site was identified in the 1950s, first developed as a DOE demonstration site in the 1970s, and significant production started by the end of 2007. The geology and geomechanical properties of the subsurface is relatively well documented in publicly available documents thanks to investigations conducted by the USGS and recent studies, and in relation to the recent EGS demonstration (Nash and Moore, 2012; Bradford et al., 2014, Bradford et al., 2015; Yuan et al, 2020).

The Miocene to Pliocene sedimentary cover is about 1.5-2 km thick and consists of sub-horizontal interbedded volcanoclastics, volcanics, sandstones, and siltstones. It overlies a proterozoic metamorphic basement consisting of quartzite, schist and quartz monzonite. The area is part of the Basin-and-range zone of ~East-West active extension. Historical seismicity rates were however very low prior to production, with normal-faulting focal mechanisms broadly consistent with E-W extension (Zandt et al., 1982). Well logs show steeply dipping fractures trending approximately N-S (Bradford et al., 2013; Nash and Moore, 2012).

Hot water is extracted at a depth of ~1500m below surface from a ~100m thick quartzite layer through four wells (Figure 1b). One well, RRG-9 (Figure 1), was found to be poorly connected to the geothermal reservoir and selected for an Enhanced Geothermal System (EGS) stimulation. To avoid thermal drawdown, the cold water is injected through three wells into a shallower reservoir at a depth of approximately 500m below surface. This reservoir consists of Late Miocene tuff, about 300m thick.

In this study we used the baseline mechanical, hydrological, and poroelastic parameters of the reservoir rocks determined in previous hydro-thermal-mechanical studies (Liu et al., 2018; Yuan et al., 2020; Bradford et al., 2014) (Table 1). The reservoir permeability and compressibility were then calibrated to the geodetic data (Supplement 1) to better constrain the pore pressure diffusion and poroelastic stress change models respectively.

Significant production started only by the end of 2007 and ramped up gradually until 2010. The site was selected for an Enhanced Geothermal System (EGS) demonstration by DOE. The EGS demonstration was conducted at well RRG-9 over three phases between February 2012 and April 2014 with the goal of using hydraulic stimulation to improve the injectivity of the surrounding reservoir. Each phase consisted of cold fluid injection followed by a shut-in period to assess the pressure falloff characteristics. The well has since been used for continuous commercial use.

The Lawrence Berkeley National Laboratory deployed a local seismic network consisting of 10 stations which started operating in early 2010 (Supplementary Figure S2). Their seismicity catalog shows seismicity clearly clustered in the vicinity of the geothermal field, and correlated with the surface deformation pattern measured from InSAR (Figure 1a). Seismicity is located primarily in the metamorphic basement immediately underlying the production reservoir. It started in late 2010, lagging the onset of large-scale production by about 2 years and pre-dating the EGS stimulation. We note that the magnitude of completeness appears to decrease from $M_c \sim 0.5$ prior to the EGS stimulation, to $M_c \sim 0$ during and after the EGS stimulation. The seismicity cluster along a steeply dipping zone trending $\sim N60^\circ E$ which coincides with the Narrows Fault zone, a basement structure which had been inferred from geophysical and hydrological studies (Bradford et al., 2013; Dolenc et al., 1981).

3 Geomechanical Modelling

In our formulation, we account for the effects of pore pressure diffusion and its resultant poroelastic stress changes. We do not consider thermal effects given that the thermal contrasts are generally most important for injection of cold water, and the injection reservoir is very shallow (~500m depth) so that the poroelastic effects would dominate over the thermal effects as observed at the Salton Sea Geothermal Field in Southern California (Barbour et al., 2016). In the production reservoir, fluid extraction should only cause minor thermal effects as heat is advected horizontally, and so the horizontal temperature gradients should be small. This is corroborated by Liu et al's study (2018), where their coupled hydro-thermal-mechanical model of the Raft River geothermal field predicts that the poroelastic effects of fluid extraction and injection would dominate for the first 10 years, and the long-term effects of cooling in the injection reservoir would only emerge after 20 years of production.

In our workflow, we calculate the pressure change in the reservoir resulting from fluid injection and extraction, the surface displacements for comparison with the InSAR measurement, and the stresses in the basement and overlying sedimentary cover for comparison with the observed seismicity. We choose to employ analytical solutions here as they minimize the number of model parameters while providing an excellent fit to the geodetically measured surface deformation data. In addition, they are computationally inexpensive, which can enable, in principle, scaling to larger systems involving thousands of wells.

Given that the geology of the Raft River site can be generally considered as a vertically layered system (Liu et al., 2018), we employ a 2D axisymmetric model for pore pressure diffusion, where the pore pressure changes corresponding to production and injection can be considered separately in what we assume are unconnected reservoirs. In this formulation, considering a single well, the pore pressures at a given time, t , and a given location, $x = (x_1, x_2)$, from the well is,

151

$$P(x, t) = \frac{1}{H \rho_0 4 \pi \kappa} \int_0^t q(t') \frac{\exp\left[\frac{-r'^2}{4 c (t-t')}\right]}{t-t'} dt' \quad (1)$$

152 where $q(t')$ is the mass flow rate, c is the diffusivity, ρ_0 is the reference density, H is the thickness of the
 153 layer, $\kappa = k/\eta$, k is the permeability, and η is the fluid viscosity. This solution is taken from Rudnicki
 154 (1986), which we modified to allow anisotropy of the pore pressure diffusion, given that the surface
 155 displacement (Figure 1a) suggests higher permeability in the ~N-S direction. The anisotropy is
 156 implemented by transforming the radius r into an elliptical anisotropic radius r' defined as

$$r' = \frac{\xi \sqrt{x_1^2 + x_2^2}}{\sqrt{\xi^2 \sin^2(\theta - \varphi) + \cos^2(\theta - \varphi)}} \quad (2)$$

157 where ξ is the anisotropy factor, φ is the anisotropy angle of the direction of low permeability, and

158 $\theta = \text{atan}\left(\frac{x_2}{x_1}\right)$. The pressure changes are calculated independently for each injection and production

159 well, and superposed for all wells within the same reservoir.

160 Given the pore pressure distribution in the production and injection reservoirs, the induced poroelastic
 161 stress and displacement fields can be approximated by gridding the pore pressure solution following
 162 Kuvshinov (2008). The solutions for the entire stress tensor and displacement vector can be found in the
 163 supplementary materials.

164 We evaluate the displacement at the surface (Supplement 1) and calibrate the model parameters using
 165 the geodetic measurements. We also evaluate the stress changes in the basement and the sedimentary
 166 cover in order to compare with seismicity. The stress changes are rotated to obtain normal and shear
 167 components on a strike-slip fault oriented at N60°E with 76° dip corresponding to the Narrows fault

168 zone (Nash and Moore, 2012), and consistent with the orientation of the seismicity cluster. We calculate
 169 the Coulomb failure stress (CFS) change

$$\Delta CFS = \Delta \tau + \mu (\Delta \sigma_n + \Delta P), \quad (6)$$

170 where $\Delta \tau$ is the change in shear stress on the fault, $\Delta \sigma_n$ is the change in normal stress, ΔP is the change
 171 in pore pressure, and $\mu=0.6$ is the friction coefficient.

172 4 Results

173 We use a volume rate of 0.1 m³/s for injection wells, and 0.075 m³/s for production wells following Liu et
 174 al. (2018), with a ramp-up time of two years. We also include the effect of the EGS injection at well RRG-
 175 9 ST1 (Figure 1) using the data reported in the thesis by Bradford (2016), discretized into monthly rates.
 176 To calibrate the model, we generate a range of model realizations for the surface displacement, and
 177 select the model parameters that minimize the misfit between the modelled and geodetically measured
 178 surface displacement. We vary the injection and production reservoir compressibility in the
 179 poroelasticity formulation continuously, and permeability in the pore pressure formulation discretely.
 180 We simulate 1 million instances of these parameters, and compare the 1D histogram of the modelled
 181 displacement at any given time sample with the corresponding measured displacement using the
 182 Wasserstein distance (Ramdas et al., 2017). We choose the Wasserstein distance as a goodness-of-fit
 183 criterion for the 1D histogram as it allows us to consider the distribution of positive and negative surface
 184 displacements while being insensitive to the exact spatial location of the bulb of uplift. The best-fit
 185 parameters for permeability and compressibility are given in Table 1. The uncertainty in the discretely
 186 sampled permeability is given as the width of the sampling bin, given that the best-fit value was
 187 preferred in all simulated instances. We determine the uncertainty for the continuously sampled
 188 compressibility parameter using a bootstrap method where we consider 100,000 subsamples of size
 189 10,000 and select the best fitting model from each subsample. We then consider the 95% confidence

interval as the 2.5th and 97.5th percentile values from the population of best-fit compressibility values (Supplementary Figure S1), and how the uncertainty affects the CFS change.

Figure 1a shows the spatial distribution of vertical displacement rate averaged from 2007 to 2011, which shows a clear signal of uplift around the injection wells. These wells are injecting at 500m below the surface, and thus have a stronger signature across a smaller footprint compared to the production which occurs at a deeper depth of ~1.5 km below the surface. The elliptical bulb of uplift is well captured by our model (Figure 1b) estimated over the same time period of 2007 to 2011, which similarly shows highly localized uplift that is elongated in the NW-SE direction and generally captures the transition distance from uplift to subsidence. The isotropic model (Supplementary Figure S3) predicts an E-W elongated uplift pattern due to the distribution of wells that fails to match this feature. The elliptical shape of the zone of uplift is reproduced well by our pore pressure diffusion model thanks to the inclusion of anisotropy. The best-fitting permeability for the injection reservoir is $5.9 \pm 1.5 \times 10^{-13} \text{ m}^2$ in the direction of slow diffusion, which is trending N70°E, and $8.3 \pm 2 \times 10^{-13} \text{ m}^2$ in the direction of fast diffusion, which is trending N20°W. The N70°E permeability is within error from the value of $4.7 \times 10^{-13} \text{ m}^2$ used by Liu et al. (2018), while the N20°W permeability indicates faster diffusion than predicted in their study. The permeability anisotropy is possibly due to the pre-existing fractures which are oriented ~N-S (Nash and Moore, 2012; Liu et al., 2018). The N20°E direction of fast diffusion and the anisotropy factor of 1.4 is also consistent with the analysis of Yuan et al., (2020), who found the permeability to be larger by a factor 1.2 to 2 along the NNE-SSW direction compared to the orthogonal direction.

Our model also reproduces the temporal behavior shown in Figure 1d, with an initial rapid uplift at location “A” before 2010, which then transitions to a steady-state with no further uplift. The seismicity is located within the general vicinity of the injection and production wells as shown in Figure 1, and begin in the basement in mid-2010 then continue in swarms of activity.

Figure 2a and 2b show the reservoir pressures resulting from injection and production respectively. As expected, these sources generate increased and decreased pore pressures in their respective reservoirs. Note that the effect of the stimulation of well RRG-9 is not visible due to the very small injection volume (Figure 3b). The resultant poroelastic stress changes in the basement, shown for April 2014 in Figure 2c and 2d for injection and production respectively, indicate that the poroelastic contributions to Coulomb failure stress (CFS) changes affect fault stability in the same manner as the pore pressures, i.e. injection causes increases in CFS due to both pore pressure and poroelastic effects, and vice versa for the production. As a result, the total CFS change in the basement (Figure 3a) suggests that injection is primarily responsible for the observed induced seismicity, which occur almost exclusively in the regions of positive CFS change. To explore the sensitivity to the assumed fault plane orientation, we test different receiver fault orientations and find that the zone of increased CFS change around the injection and production wells is largely unchanged. See Supplementary Figure S4 for the case of left-lateral and normal N-S faults parallel to regional documented faults (Nash and Moore, 2012).

The time evolution of CFS at the location of maximum uplift (point A) and the edge of the seismicity cloud (point B) suggests that the eastern edge of the seismicity is dominated entirely by stresses from the injection, while stresses on the western edge of the seismicity are inhibited significantly by the production (Figure 3c). Note that the pressure evolution at point B, located near well RRG-9, shows a very short-lived pressure increase. This figure also shows that although the simulation assumes a simple ramp to constant flow rate from 2008 to 2010, the zone of Coulomb stress increase due to poroelastic loading of the basement keeps increasing until the end of the simulation as the zone of high pore pressure in the shallow reservoir expands away from the injection wells. This can explain the sustained seismic activity. Additionally, the CFS change at “A” as shown in Figure 3c indicates there may be a critical Coulomb stress increase of approximately 50kPa required to trigger the seismicity. That would represent the initial strength excess, i.e. the initial distance from the failure criterion, within the

Narrows fault zone. To further investigate this, we calculate the CFS change at the specific origin time and hypocentral location of the observed earthquakes (Figure 4a). In this calculation we assume the same hypocentral depth of 500m for events in the basement, and -500m for events in the overlying sedimentary cover. We can see that nucleation stresses range from 0 to 70kPa for events in the basement and the overlying sedimentary cover, and the histograms shown in Figure 4b and 4c show a possibly bimodal distribution of nucleation stress for the basement with a main mode at 19kPa. It is interesting that the two histograms are actually quite similar despite the fact that very few earthquakes occurred in the sedimentary cover. According to our analysis a given volume of basement rocks submitted to a given ΔCFS produces 4 times more earthquakes than the same volume of sedimentary rocks submitted to the same ΔCFS . This is because the earthquake productivity, representing the density of possible nucleation points of earthquake with magnitude larger than the detection threshold, must be 4 times larger in the basement than in the sedimentary cover (Figure 4d).

Given the magnitude of the pore pressure changes in the production reservoir, which are about 100 times larger than the magnitude of the poroelastic stress changes, we believe it is justified to consider the production reservoir to be uncoupled from the basement, otherwise we would not expect any seismicity whatsoever since the pore pressure reduction from extraction would completely dominate the state of stress in the basement. We account for the hydraulic stimulation at RRG-9-ST1 as an additional injection well located in the production reservoir, although we note that its corresponding pore pressure contributions are small relative to the standard production wells given the low injection volumes (Figure 3b). This can be seen in the stress changes at point “B” (Figure 3c), which is located close to well RRG-9 but only experiences small stress changes on the order of ~1kPa as a result of the stimulation at the well. Considering the spatial distribution of seismicity prior to the first stimulation phase, we see that the majority of the central seismicity cloud is already activated before March 2012 even with the lower magnitude of completeness (Supplementary Figure S2), and so the hydraulic

stimulations likely did not significantly affect the hydraulic connection between the basement and the production reservoir. This is supported by the observation that we do not generally see spatial diffusion of earthquake events away from well RRG-9 after the three stimulation events (Supplementary Figure S2c).

5 Discussion and Conclusions

Together with previous studies which have adopted a similar strategy (Juanes et al., 2016; Shirzaei et al., 2016), our study demonstrates the value of combining observation of surface deformation and simple fluid flow and geomechanical modeling to analyze induced seismicity due to injection and extraction of fluids from the subsurface. We acknowledge that our evaluation of uncertainties incorporates only the sensitivity of our analytical solution, and does not account for potential sources of correlated error in the InSAR measurements (*e.g.* tropospheric corrections, ionospheric effects) or epistemic uncertainties relating to our assumption of homogeneous reservoir properties in a homogeneous elastic half-space. Nevertheless, we believe that our main findings, at least qualitatively, are not dependent on these uncertainties, given the similarity of our modelled and measured surface displacements with previous works (Liu et al., 2018; Ali et al., 2018), as well as our ability to resolve the permeability anisotropy suggested by Yuan et al. (2020).

The spatial distribution of ΔCFS contributions (Figs 2c, 2d) in the basement strongly suggest that poroelastic stress changes from shallow injection is responsible for the timing and location of observed induced seismicity. The pore pressures from injection are not connected to the basement and the poroelastic stress changes resulting from fluid extraction are smaller in magnitude compared to the injection. Figure 3a, which shows the net ΔCFS in the basement, indicates that all earthquake events occur in the region of positive slip potential, which suggests that while the magnitude of the contribution from production is small, it nevertheless has an inhibiting effect on fault slip potential, for

example in the region to the north of well RRG-9 ST1. In terms of the distribution of ΔCFS at the time and location of earthquake nucleations (Figure 4), we also find that the basement has an initial strength excess of approximately 15 – 20kPa, and an excess of 20 – 25kPa in the overlying sedimentary cover which is required to activate the fault, similar to the observations at Groningen by Smith (2019).

In terms of the timing of seismicity in relation to the DOE hydraulic fracturing project at well RRG-9 ST1, our results show that the seismicity begins in late 2010 whereas the first phase at well RRG-9 ST1 begins in early 2012. This, in conjunction with the minimal CFS changes at “B” (located close to well RRG-9 ST1) in Figure 3c, show that while the project did indeed trigger some induced events (Bradford, 2016), the timing and location nevertheless correspond to the larger-scale spatial distribution of CFS change shown in Figure 3a.

Overall, our results show that the observed spatial and temporal distribution of surface deformation and induced seismicity at the Raft River geothermal site may be reasonably explained by simple analytical solutions for axisymmetric pore pressure diffusion and its resultant poroelastic stress changes. Our model uses only a simplified 1D geological model as well as injection and production rates as inputs, where geomechanical parameters are constrained by fitting the modelled surface displacement to the true surface displacement as observed by InSAR measurements. This simple framework is scalable and easily calibrated given the small number of parameters, and can be readily applied to investigate large multi-well systems involving combined injection and production such as Oklahoma and Texas (Langenbruch and Zoback, 2016; Zhai et al., 2018; Walter et al., 2018), where existing studies are primarily focused on the effects of fluid injection. Our framework may be used to inform geothermal and carbon storage strategies, where the seismicity in the basement and elsewhere could in principle be controlled by regulating the injection rates (Kwiatek et al., 2019; Birkholzer et al., 2012; Cihan et al., 2015). We conjecture that, using the modeling workflow presented in this study, the location and time-

307 evolution of seismicity induced by fluid extraction could in principle be controlled by adjusting well flow
308 rates.

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References

- Alghannam, M. & Juanes, R., 2020. Understanding rate effects in injection-induced earthquakes, *Nature Communications*, 11.
- Ali, S.T., Reinisch, E.C., Moore, J., Plummer, M., Warren, I., Davatzes, N.C., Feigl, K.L. (2018) Geodetic measurements and numerical models of transient deformation at Raft River geothermal field, Idaho, USA. *Geothermics*, 74, 106-111, doi: 10.1016/j.geothermics.2018.02.007
- Barbour, A.J., Evans, E.L., Hickman, S.H., Eneva, M. (2016) Subsidence rates at the southern Salton Sea consistent with reservoir depletion. *Journal of Geophysical Research: Solid Earth*, 121, 5308–5327, doi:10.1002/2016JB012903
- Birkholzer, J.T., Cihan, A. & Zhou, Q., 2012. Impact-driven pressure management via targeted brine extraction-Conceptual studies of CO₂ storage in saline formations, *International Journal of Greenhouse Gas Control*, 7, 168-180.
- Bourne, S.J., Oates, S.J., van Elk, J., Doornhof, D. (2014) A seismological model for earthquakes induced by fluid extraction from a subsurface reservoir. *Journal of Geophysical Research: Solid Earth*, 119(12), 8991-9015, doi: 10.1002/2014JB011663
- Bourne, S.J. & Oates, S.J., 2017. Extreme Threshold Failures Within a Heterogeneous Elastic Thin Sheet and the Spatial-Temporal Development of Induced Seismicity Within the Groningen Gas Field, *Journal of Geophysical Research-Solid Earth*, 122, 10299-10320.
- Bradford, J.T. (2016) The Application of Hydraulic and Thermal Stimulation Techniques to Create Enhanced Geothermal Systems (Doctoral Dissertation)
- Bradford, J., McLennan, J., Moore, J., Glasby, D., Waters, D., Kruwell, R., Bailey, A., Rickard, W., Bloomfield, K., King, D. (2013) Recent developments at the Raft River geothermal field. In: *Proceedings of the 38th workshop on geothermal reservoir engineering*, Stanford, CA 2013
- Bradford, J., McLennan, J., Moore, J., Podgorney, R., Tiwari, S. (2015) Hydraulic and Thermal Stimulation Program at Raft River Idaho, A DOE EGS. *Geothermal Resources Council Transactions*, 39, 261-268.
- Bradford, J.T., Ohren, M., Osborn, W.L., McLennan, J., Moore, J., Podgorney, R. (2014) Thermal Stimulation and Injectivity Testing at Raft River, ID EGS Site. *PROCEEDINGS, Thirty-Ninth Workshop on*

- 344 *Geothermal Reservoir Engineering* Stanford University, Stanford, California, February 24-26, 2014 SGP-
345 TR-202
- 346 Chaussard, E., Burgmann, R., Shirzaei, M., Fielding, E.J. & Baker, B., 2014. Predictability of hydraulic head
347 changes and characterization of aquifer-system and fault properties from InSAR-derived ground
348 deformation, *Journal of Geophysical Research: Solid Earth*, 119, 6572-6590.
- 349 Cihan, A., Birkholzer, J.T. & Bianchi, M., 2015. Optimal well placement and brine extraction for pressure
350 management during CO₂ sequestration, *International Journal of Greenhouse Gas Control*, 42, 175-187.
- 351 Dieterich, J.H., 1994. A constitutive law for the rate of earthquake production and its application to
352 earthquake clustering, *J. Geophys. Res.*, 99, 2601-2618.
- 353 Dolenc, M. R., Hull, L. C., Mizell, S. A., Russell, B. F., Skiba, P. A., Strawn, J. A., et al. (1981). Raft River
354 geoscience case study. (EGG-2125). Idaho Falls, Idaho: EG&G, Idaho, Inc.
- 355 Elsworth, D., Fang, Y., Gan, Q., Im, K. J., Ishibashi, T., & Guglielmi, Y. (2016). Induced seismicity in the
356 development of EGS—benefits and drawbacks. In H. Li, J. Li, Q. Zhang, & J. Zhao (Eds.), *Rock Dynamics:
357 From Research to Engineering - 2nd International Conference on Rock Dynamics and Applications,*
358 *ROCDYN 2016* (pp. 13-24). CRC Press/Balkema. doi:10.1201/b21378-4
- 359 Ellsworth, W. (2013) Injection-Induced Earthquakes. *Science*, 341(6142). doi: 10.1126/science.1225942
- 360 Farr, T. G., Rosen, P. A., Caro, E., Crippen, R., Duren, R., Hensley, S., et al. (2007). The shuttle radar
361 topography mission. *Reviews of Geophysics*, 45(2), Rg2004. doi: 10.1029/2005rg000183
- 362 Franceschetti, G., & Lanari, R. (1999). *Synthetic aperture radar processing*. Boca Raton, Florida: CRC
363 Press.
- 364 Goebel, T.H.W. & Brodsky, E.E. (2018) The spatial footprint of injection wells in a global compilation of
365 induced earthquake sequences. *Science*, 361(6405), 899-904, doi: 10.1126/science.aat5449
- 366 Goebel, T.H.W., Weingarten, M., Chen, X., Haffener, J. & Brodsky, E.E., 2017. The 2016 Mw5.1 Fairview,
367 Oklahoma earthquakes: Evidence for long-range poroelastic triggering at > 40 km from fluid disposal
368 wells, *Earth and Planetary Science Letters*, 472, 50-61.
- 369 Goertz-Allman, B.P., Gibbons, S.J., Oye, V., Bauer, R., Will, R. (2017) Characterization of induced
370 seismicity patterns derived from internal structure in event clusters. *Journal of Geophysical Research:*
371 *Solid Earth*, 122(5), 3875-3894, doi: 10.1002/2016JB013731
- 372 Hooper, A., & Zebker, H. A. (2007). Phase unwrapping in three dimensions with application to InSAR
373 time series. *J. Opt. Soc. Am. A.*, 24(9).
- 374 Hoffmann, J., Zebker, H.A., Galloway, D.L. & Amelung, F., 2001. Seasonal subsidence and rebound in Las
375 Vegas Valley, Nevada, observed by synthetic aperture radar interferometry, *Water Resources Research*,
376 37, 1551-1566.
- 377 Hornbach, M.J., DeShon, H.R., Ellsworth, W.L., Stump, B.W., Hayward, C., Frohlich, C., Oldham, H.R.,
378 Olson, J.E., Magnani, M.B., Brokaw, C., Luetgert, J.H. (2015). Causal factors for seismicity near Azle,
379 Texas. *Nature Communications*, 6, doi: 10.1038/ncomms7728

- 380 Ito, T. & Zoback, M.D., 2000. Fracture permeability and in situ stress to 7 km depth in the KTB Scientific
381 Drillhole, *Geophysical Research Letters*, 27, 1045-1048.
- 382 Juanes, R., Jha, B., Hager, B.H., Shaw, J.H., Plesch, A., Astiz, L., Dieterich, J.H. & Frohlich, C., 2016. Were
383 the May 2012 Emilia-Romagna earthquakes induced? A coupled flow-geomechanics modeling
384 assessment, *Geophysical Research Letters*, 43, 6891-6897.
- 385 King, G.C.P., Stein, R.S. & Lin, J., 1994. Static Stress Changes and The Triggering Of Earthquakes, *Bulletin*
386 *Of The Seismological Society Of America*, 84, 935-953.
- 387 Kuvshinov, B.N. (2008) Elastic and piezoelectric fields due to polyhedral inclusions. *International Journal*
388 *of Solids and Structures*, 45(5), 1352-1384, doi: 10.1016/j.ijsolstr.2007.09.024
- 389 Kwiatak, G., Saarno, T., Ader, T., Bluemle, F., Bohnhoff, M., Chendorain, M., Dresen, G., Heikkinen, P.,
390 Kukkonen, I., Leary, P., Leonhardt, M., Malin, P., Martinez-Garzon, P., Passmore, K., Pasmore, P.,
391 Valenzuela, S., Wollin, C. (2019) Controlling fluid-induced seismicity during a 6.1-km-deep geothermal
392 stimulation in Finland. *Science Advances*, 5(5), doi: 10.1126/sciadv.aav7224
- 393 Langenbruch, C. & Zoback, M.D. (2016) How will induced seismicity in Oklahoma respond to decreased
394 saltwater injection rates? *Science Advances*, 2(11), doi: 10.1126/sciadv.1601542
- 395 Lawrence Berkeley Induced Seismicity EGS. Interactive, Map of Earthquakes at Raft River.
396 http://esd.lbl.gov/research/projects/induced_seismicity/egs/raft_river.html (accessed April, 2021).
- 397 Liu, F., Fu, P., Mellors, R.J., Plummer, M.A., Ali, S.T., Reinisch, E.C., Liu, Q., Feigl, K.L. (2018) Inferring
398 Geothermal Reservoir Processes at the Raft River Geothermal Field, Idaho, USA, Through Modeling
399 InSAR–Measured Surface Deformation. *Journal of Geophysical Research: Solid Earth*, 123(5), 3645-3666,
400 doi: 10.1029/2017JB015223
- 401 Lopez-Martinez, C., & Fabregas, X. (2002). Modeling and reduction of SAR interferometric phase noise in
402 the wavelet domain. *Ieee Transactions on Geoscience and Remote Sensing*, 40(12), 2553-2566. doi:
403 10.1109/TGRS.2002.806997
- 404 Mignan, A., Landtwing, D., Kastli, P., Mena, B., Wiemer, S. (2015) Induced seismicity risk analysis of the
405 2006 Basel, Switzerland, Enhanced Geothermal System project: Influence of uncertainties on risk
406 mitigation. *Geothermics*, 53, 133-146, doi: 10.1016/j.geothermics.2014.05.007
- 407 Nash, G.D. & Moore, J.N. (2012) Raft River EGS Project A GIS Centric Review of Geology. *Geothermal*
408 *Resources Council Transactions*, 36, 951-958.
- 409 Ramdas, A., Trillos, N.G., Cuturi, M. (2017) On Wasserstein Two-Sample Testing and Related Families of
410 Nonparametric Tests. *Entropy*, 19(2), doi: 10.3390/e19020047
- 411 Rudnicki, J.W. (1986) Fluid mass sources and point forces in linear elastic diffusive solids. *Mechanics of*
412 *Materials*, 5(4), 383-393
- 413 Segall, P., Grasso, J.R. & Mossop, A., 1994. Poroelastic stressing and induced seismicity near the Lacq
414 gas-field, southwestern France, *Journal of Geophysical Research: Solid Earth*, 99, 15423-15438.
- 415 Segall, P. & Fitzgerald, S.D., 1998. A note on induced stress changes in hydrocarbon and geothermal
416 reservoirs, *Tectonophysics*, 289, 117-128.

- 417 Shapiro, S.A., Huenges, E. & Borm, G., 1997. Estimating the crust permeability from fluid-injection-
418 induced seismic emission at the KTB site, *Geophysical Journal International*, 131, F15-F18.
- 419 Shirzaei, M. (2013). A Wavelet-Based Multitemporal DInSAR Algorithm for Monitoring Ground Surface
420 Motion. *IEEE Geoscience and Remote Sensing Letters*, 10(3), 456-460. doi: 10.1109/Lgrs.2012.2208935
- 421 Shirzaei, M., & Bürgmann, R. (2012). Topography correlated atmospheric delay correction in radar
422 interferometry using wavelet transforms. *Geophysical Research Letters*, 39(1), L01305. doi:
423 10.1029/2011GL049971
- 424 Shirzaei, M., & Bürgmann, R. (2013). Time-dependent model of creep on Hayward fault inferred from
425 joint inversion of 18 years InSAR time series and surface creep data. *Journal of Geophysical Research-
426 Solid Earth*, 118, 1733-1746. doi: 10.1002/jgrb.50149
- 427 Shirzaei, M., Ellsworth, W.L., Tiampo, K.F., Gonzalez, P.J. & Manga, M., 2016. Surface uplift and time-
428 dependent seismic hazard due to fluid injection in eastern Texas, *Science*, 353, 1416-1419.
- 429 Shirzaei, M., & Walter, T. R. (2011). Estimating the Effect of Satellite Orbital Error Using Wavelet-Based
430 Robust Regression Applied to InSAR Deformation Data. *Ieee Transactions on Geoscience and Remote
431 Sensing*, 49(11), 4600-4605. doi: 10.1109/Tgrs.2011.2143419
- 432 Smith, J. D. (2019). Geomechanical properties of the Groningen reservoir (doctoral thesis). doi:
433 10.17863/CAM.41005
- 434 Stein, R.S., 1999. The role of stress transfer in earthquake occurrence, *Nature*, 402, 605-609.
- 435 Stork, A.L., Verdon, J.P., Kendall, J.-M. (2015) The microseismic response at the In Salah Carbon Capture
436 and Storage (CCS) site. *International Journal of Greenhouse Gas Control*, 32, 159-171, doi:
437 10.1016/j.ijggc.2014.11.014
- 438 Tan, Y., Hu, J., Zhang, H., Chen, Y., Qian, J., Wang, Q., Zha, H., Tang, P., Nie, Z. (2020) Hydraulic Fracturing
439 Induced Seismicity in the Southern Sichuan Basin Due to Fluid Diffusion Inferred From Seismic and
440 Injection Data Analysis. *Geophysical Research Letters*, 47(4). doi: 10.1029/2019GL084885
- 441 Walter, J.I., Frohlich, C., Borgfeldt, T. (2018) Natural and induced seismicity in the Texas and Oklahoma
442 Panhandles. *Seismological Research Letters*, 89(6), 2437-2446, doi: doi.org/10.1785/0220180105
- 443 Yuan, Y.L., Xu, T.F., Moore, J., Lei, H.W. & Feng, B., 2020. Coupled Thermo-Hydro-Mechanical Modeling
444 of Hydro-Shearing Stimulation in an Enhanced Geothermal System in the Raft River Geothermal Field,
445 USA, *Rock Mechanics and Rock Engineering*, 53, 5371-5388.
- 446 Zandt, G, McPherson, L, Schaff, S, & Olsen, S. Seismic baseline and induction studies: Roosevelt Hot
447 Springs, Utah and Raft River, Idaho. *United States*. doi:10.2172/6396329
- 448 Zhai, G. & Shirzaei, M. (2018). Fluid Injection and Time-Dependent Seismic Hazard in the Barnett Shale,
449 Texas. *Geophysical Research Letters*, 45(10), 4743-4753. doi: 10.1029/2018GL077696
- 450 Zhai, G., Shirzaei, M., Manga, M., Chen, X. (2019). Pore-pressure diffusion, enhanced by poroelastic
451 stresses, controls induced seismicity in Oklahoma. *Proceedings of the National Academy of Sciences*,
452 116 (33), 16228-16233. doi: 10.1073/pnas.1819225116

453 Zoback, M.D. & Gorelick, S.M., 2012. Earthquake triggering and large-scale geologic storage of carbon
454 dioxide, *Proceedings of the National Academy of Sciences of the United States of America*, 109, 10164-
455 10168. doi: 10.1073/pnas.1202473109

Tables and Figures

Table 1: Hydro-and geomechanical properties used for simulation of pore pressures and poroelastic stress changes. The parameters which are calibrated using the surface deformation measurements are shown in bold. The values in parentheses indicate a priori values, and uncertainties at the 95% confidence level are estimated from bootstrap sampling (Supplementary Figure S1).

	Injection Reservoir	Production Reservoir	Narrows Fault
Fluid density ρ , (kg/m ³)	998	998	
Fluid viscosity, (Pa s)	8.9×10^{-4}	8.9×10^{-4}	
Skempton's coefficient, B	0.75	0.75	
Permeability, k (m²)	$5.9 \pm 1.5 \times 10^{-13}$ (4.7×10^{-13})	$5 \pm 1.3 \times 10^{-13}$ (4×10^{-13})	
Porosity	0.15	0.15	
Compressibility, C_m (Pa⁻¹)	$6.1 \pm 0.3 \times 10^{-9}$ (5.1×10^{-9})	$2.5 \pm 0.4 \times 10^{-10}$ (2.04×10^{-9})	
Shear modulus, μ (GPa)	0.833	2.08	
Thickness, (m)	300	100	
Biot coefficient, α	0.31	0.31	
Poisson's ratio, ν	0.2	0.2	
Flow anisotropy factor, ξ	1.4	1.4	
Flow anisotropy angle, φ	20° (slow diffusion N70°E)	20° (slow diffusion N70°E)	
Friction angle, (°)			31
Strike, (°)			N60°E
Dip, (°)			76
Sense			Sinistral

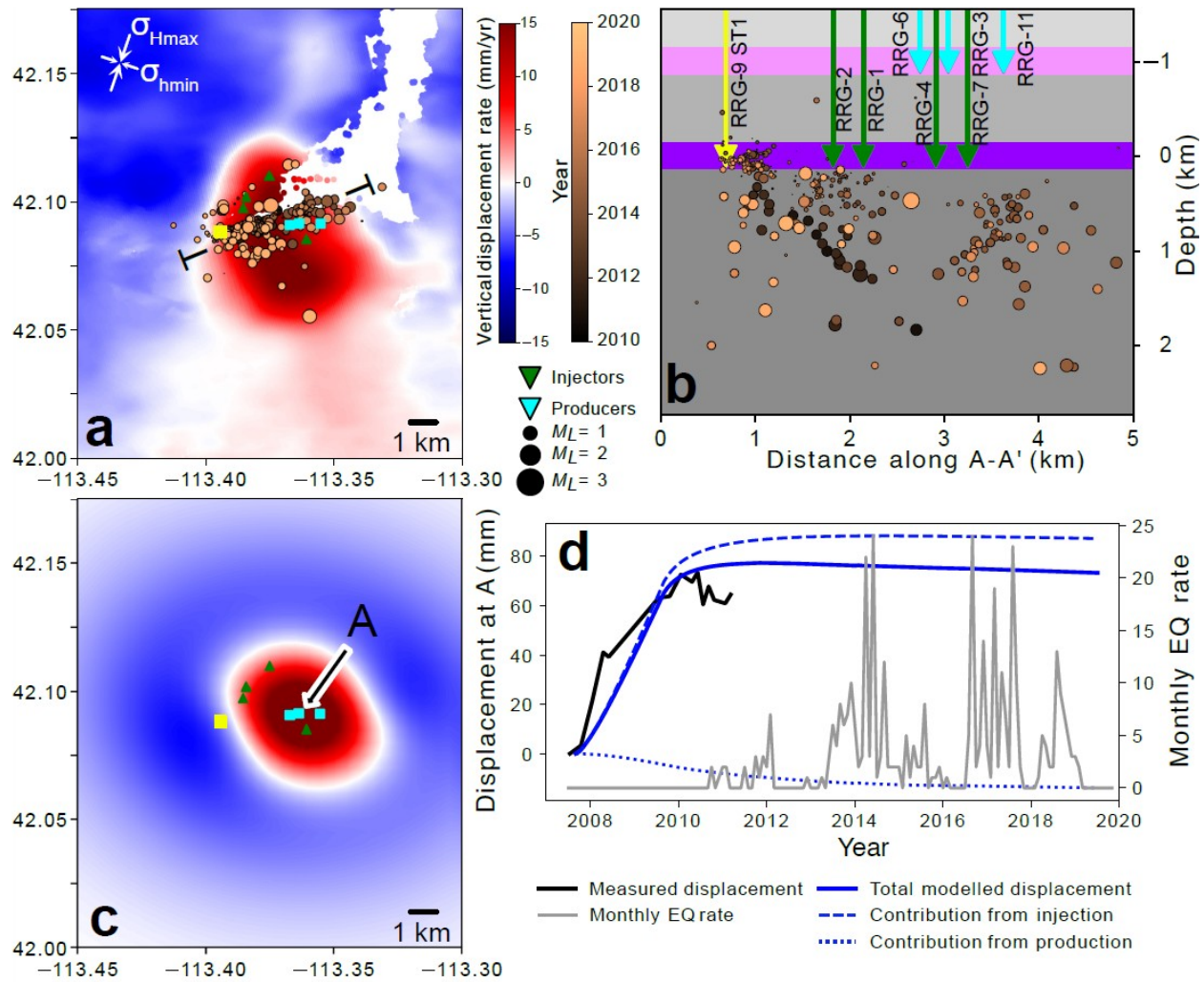


Figure 1: Summary showing a) the geodetically measured surface displacement rate during 2007-2011, location of injection and production wells, and detected earthquakes; b) southeast-northwest depth cross section of simplified site geology, showing well and earthquake locations; c) modelled surface displacement rate; d) time evolution of seismicity rate and measured and modelled surface displacements at point “A”. DOE experimental well RRG-9, which is injecting into the production reservoir, is shown in the yellow square. Vertical displacement referenced as positive upwards, depths referenced to sea level. EQ = Earthquake.

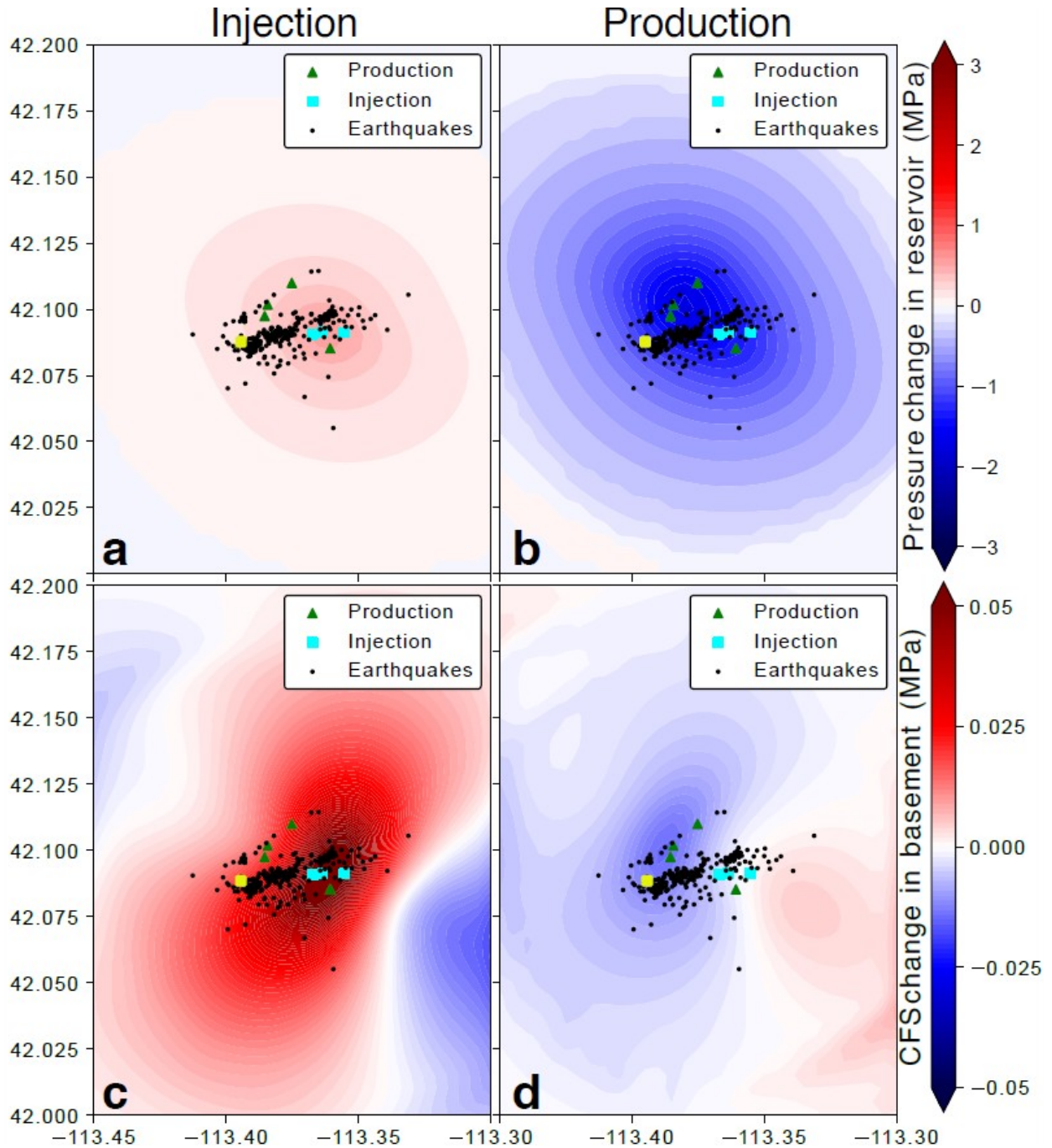


Figure 2: Spatial maps of pressure change in the reservoirs in April 2014 corresponding to a) injection, b) production; and Coulomb failure stress (CFS) changes in the basement attributed to c) injection and d) production, calculated on a steeply dipping left-lateral N60E fault.

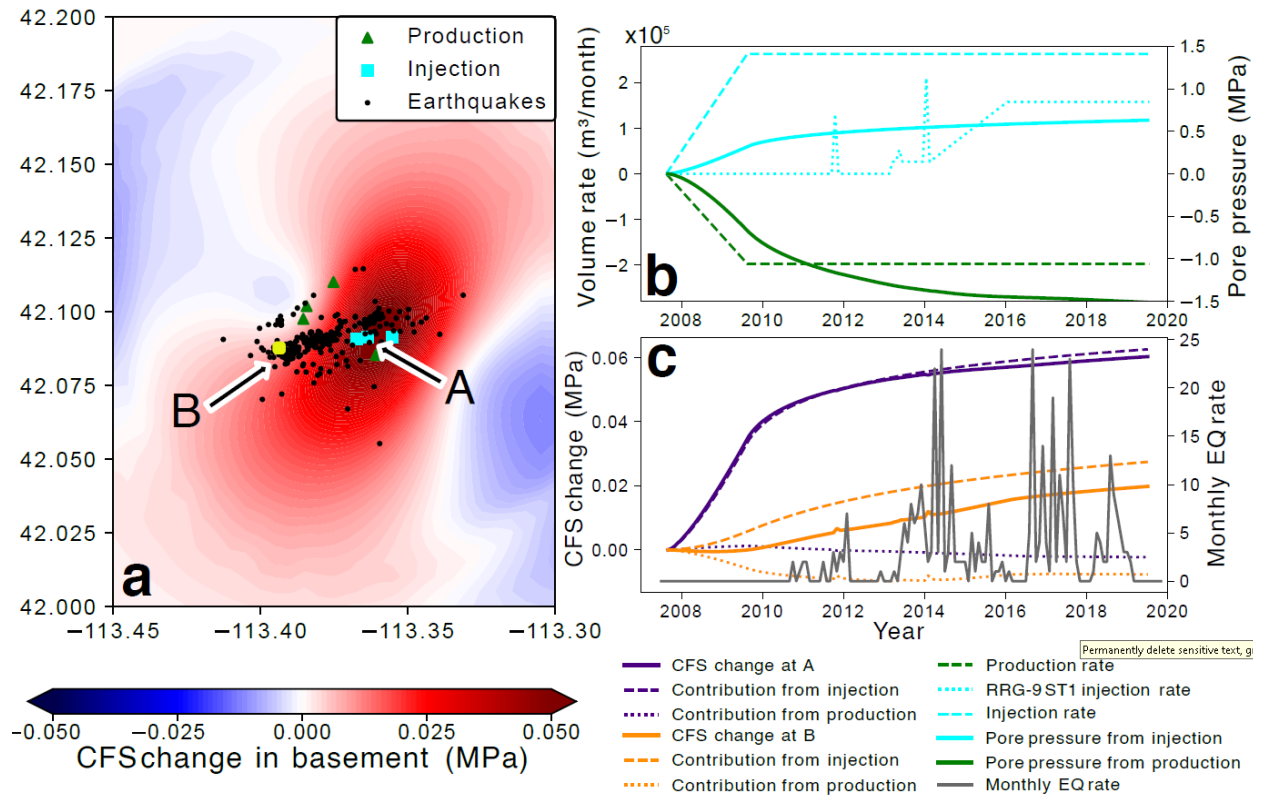


Figure 3: Modelled Coulomb failure stress (CFS) changes in the basement due to the combined effects of injection and production. a) shows the spatial distribution of CFS in the basement in April 2014, b) shows the imposed volume rates, c) shows the modelled CFS change at points “A” and “B” (Figure 1b) in the basement over time, alongside the measured seismicity rate.

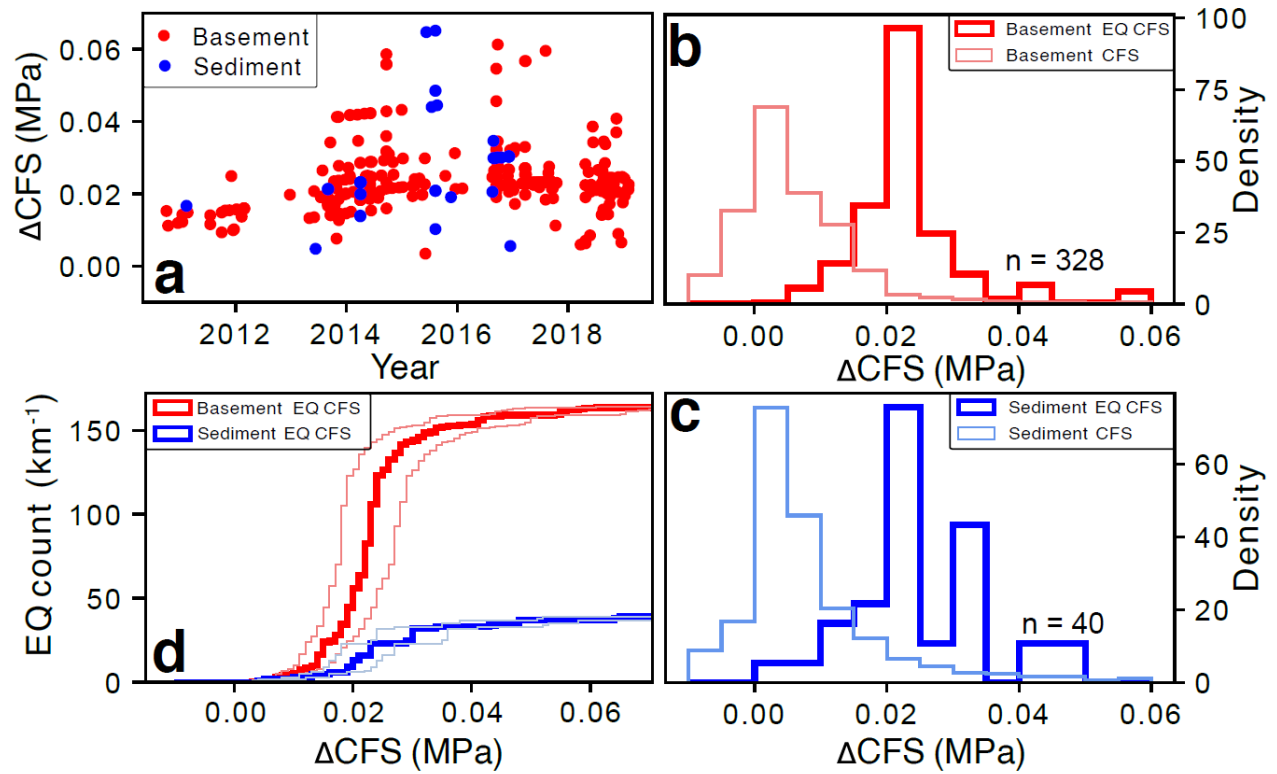


Figure 4: Coulomb failure stress (CFS) at time and location of detected earthquakes, a) shown over time for events detected in the basement and the overlying sedimentary cover. b) and c) show the histograms of the CFS at earthquake nucleation compared to the overall distribution of CFS in the basement and sedimentary cover formation respectively. d) Cumulative histogram of CFS at earthquake nucleation for the basement and the sedimentary cover, normalized by the thickness of the activated rock (1km for sediment, 2km for basement). Light coloured lines indicate 95% confidence intervals estimated according to bootstrap sampling (Supplementary Figure S1). EQ = Earthquake.

Supplement 1 - Spatio-temporal evolution of surface deformation

Following on previous studies (Ali et al., 2018; Liu et al.), we use Interferometric Synthetic Aperture Radar (InSAR) to measure the time evolution of surface deformation associated with the geothermal operations at the Raft River site. To this end, we use a wavelet-based multitemporal InSAR algorithm, so-called WabInSAR (Shirzaei, 2013; Shirzaei & Bürgmann, 2013), applied to a time series of L-band SAR images. The data set is comprised of 17 Level 1.0 Single-Look Complex (SLC) images acquired by ALOS PALSAR in the ascending path #204 and frame #830, spanning 6/13/2007 to 2/6/2011. To reduce the effect of speckle noise, SLCs are multilooked with a factor of 10 and 16 along the range and azimuth, respectively, generating pixels with size of 47m \times 50m. All the SLCs are then accurately coregistered to a single reference image, which is chosen in a way that minimizes the total spatiotemporal baseline. We then form 90 interferograms between pair of SLC images whose acquisition dates is less than 1500 days apart and their perpendicular baseline (a parameter related to the orbital position of the satellite during the two acquisitions) is shorter than 2 km. The interferograms are then flattened using satellite ephemeris data and a Digital Elevation Model (DEM) with 30m resolution provided by the Shuttle Radar Topography Mission (SRTM) (Farr et al., 2007) to remove the effects of a flat earth and surface topography (Franceschetti & Lanari, 1999). The elite (i.e., less noisy) pixels are next identified using a statistical test, which investigates the time series of complex interferometric phase noise in the wavelet domain (Lopez-Martinez & Fabregas, 2002; Shirzaei, 2013). Next, the absolute estimates of the phase change associated with the identified elite pixels is obtained by applying an iterative three-dimensional phase unwrapping algorithm (Hooper & Zebker, 2007).

A set of wavelet-based filters are used to remove the nuisance signal associated with various sources of error in the unwrapped interferograms. The spatially correlated nuisance terms are mainly caused by the atmospheric delay and the orbital and satellite clock errors. To remove these errors, each

511 unwrapped interferogram is decomposed into its high-pass and low-pass sub-bands using a two-
 512 dimensional multiresolution wavelet transformation. The effect of residual orbital errors is removed by
 513 fitting a 2nd order polynomial to the average component (i.e., the high-pass sub-band) through a robust
 514 regression method (Shirzaei & Walter, 2011). On the other hand, the details coefficients (i.e., the low-
 515 pass sub-bands) are down-weighted according to their correlation with the corresponding details
 516 coefficients associated with the DEM of the study area to correct the interferogram for the phase
 517 contributions from the topography-correlated component of atmospheric delay (Shirzaei & Bürgmann,
 518 2012). Moreover, the detail coefficients are further refined using a low-pass filter generated based on
 519 the Legendre polynomial wavelets to reduce the effect of residual DEM error, which appears as a high-
 520 spatial-frequency noise (Shirzaei, 2013).

521 The corrected unwrapped interferograms are then inverted using an iterative re-weighted least squares
 522 method (O'leary, 1990), where the weight of observation in each iteration changes based on the
 523 residuals from the previous iteration (Shirzaei, 2013), to obtain the deformation time series. Surface
 524 deformation rate at the location of elite pixels is then estimated as the slope of best-fitting line to the
 525 associated time series. Assuming all the deformation are vertical, the line-of-sight (LOS) observation is
 526 finally converted to the up-down direction using the LOS unit vector, which is a function of incidence
 527 angle at the location of elite pixels.

528 Supplement 2 – Full Poroelastic Solutions

529 Here, ΔP is the pressure change in the grid cell in the reservoir, vertices with index i referring to the
 530 vertices of the grid cell, $R_{\pm} = (\bar{x}^2 + \bar{y}^2 + \bar{z}_{\pm}^2)^{\frac{1}{2}}$, $\bar{z}_{\pm} = z_i \pm z_{eval}$, $\bar{x}_i = x_i - x_{eval}$ etc., and x_{eval} denotes the
 531 location where the stress or displacement is evaluated.

$$532 \quad \sigma_{xx}(x, t) = \Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \ddot{u}_i$$

$$533 \quad \sigma_{yy}(x, t) = \Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \ddot{u}_i$$

$$534 \quad \sigma_{zz}(x, t) = \Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z} \mathfrak{z}$$

$$535 \quad \sigma_{xy}(x, t) = -\Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z} \mathfrak{z}$$

$$536 \quad \sigma_{xz}(x, t) = \Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z} \mathfrak{z}$$

$$537 \quad \sigma_{yz}(x, t) = \Delta P \frac{\alpha C_m \mu}{2\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z} \mathfrak{z}$$

$$538 \quad U_x(x, t) = \Delta P \frac{\alpha C_m}{4\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z}$$

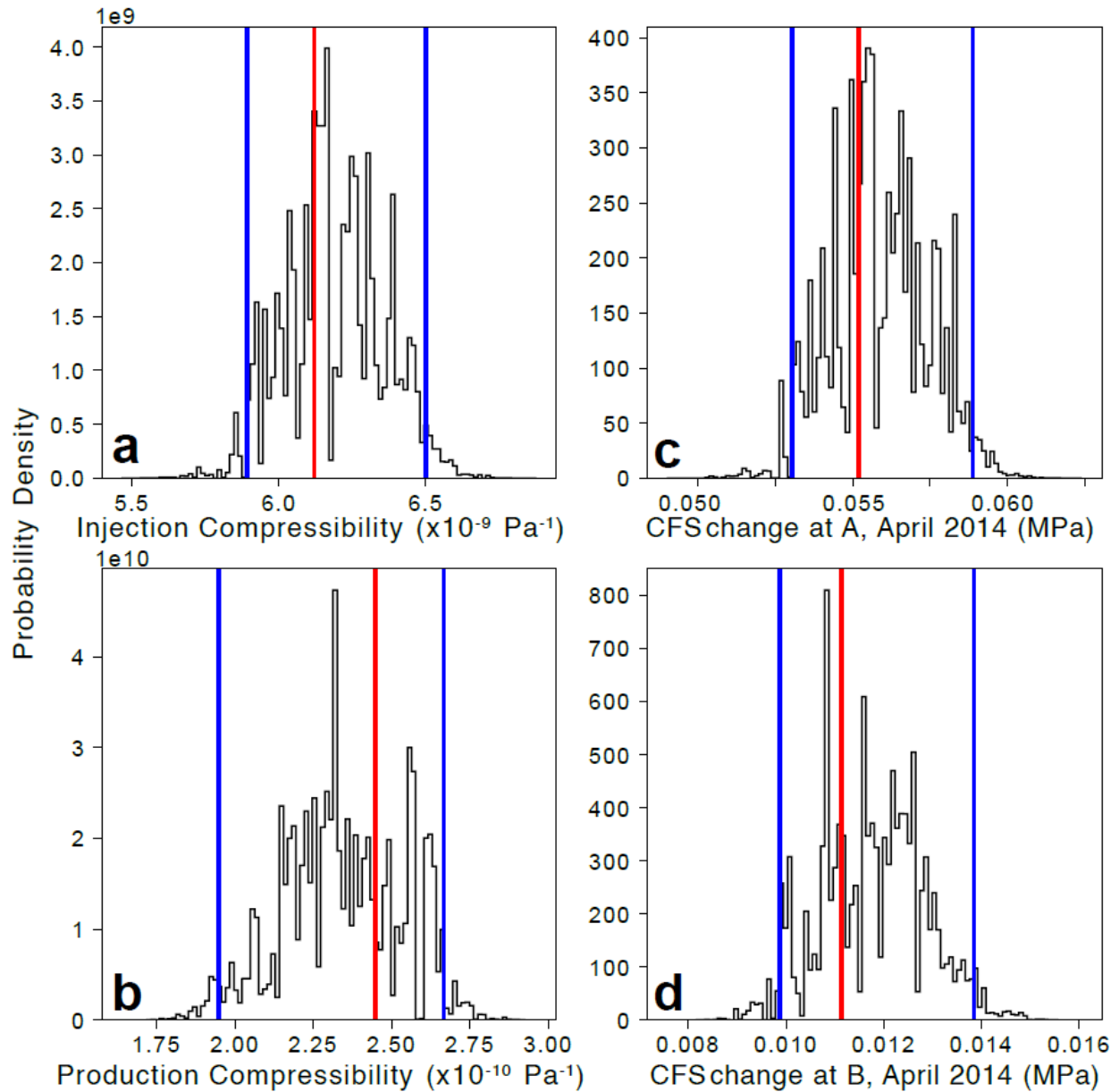
$$539 \quad U_y(x, t) = \Delta P \frac{\alpha C_m}{4\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z}$$

$$540 \quad U_z(x, t) = -\Delta P \frac{\alpha C_m}{4\pi} \sum_{vertices} (-1)^{i-1} \mathfrak{z}$$

$$541 \quad f(x, y, Z, R) = Z \operatorname{atan}\left(\frac{xy}{ZR}\right) - x \ln(R+y) - y \ln(R+x)$$

542

543 Supplement 3 – Supplemental Figures and Tables



544

545 **Figure S1:** Results of 100,000 bootstrap samples each of size 10,000 to quantify model uncertainty. a)
 546 histogram of best-fit injection reservoir compressibility, b) histogram of best-fit production reservoir
 547 compressibility, c) histogram of best-fit Coulomb failure stress (CFS) change values at point “A” in Figure
 548 1a, d) histogram of CFS change at point “B” Figure 3a. Red lines indicate overall best fit model, based on
 549 1,000,000 generated samples, and blue lines indicate 2.5th and 97.5th percentiles denoting the 95%
 550 confidence range.

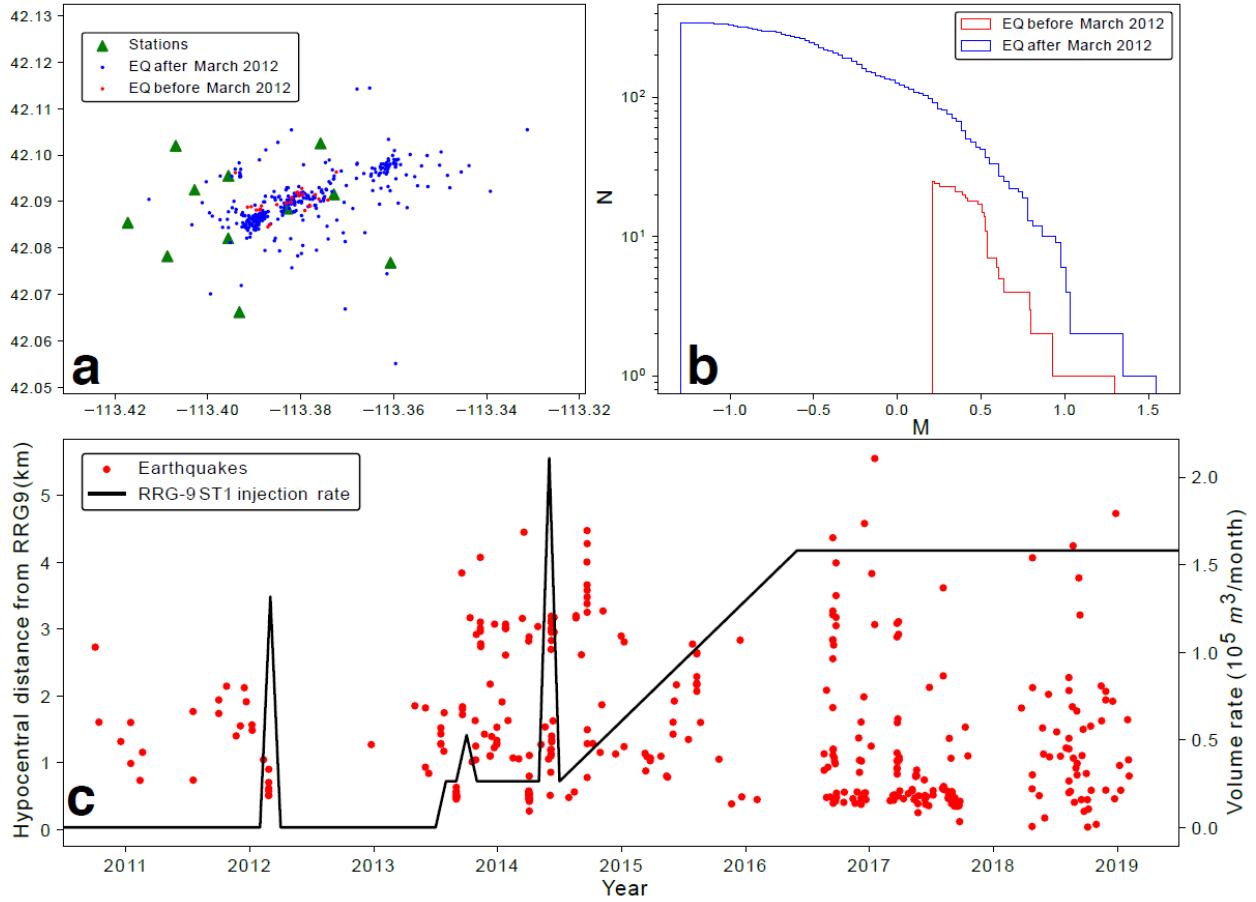


Figure S2: Summary plots showing a) location of seismicity before and after the first hydraulic stimulation in March 2012 alongside station locations, b) Frequency-Magnitude distribution of events, c) timing and distance of earthquakes relative to the RRG-9 wellhead.

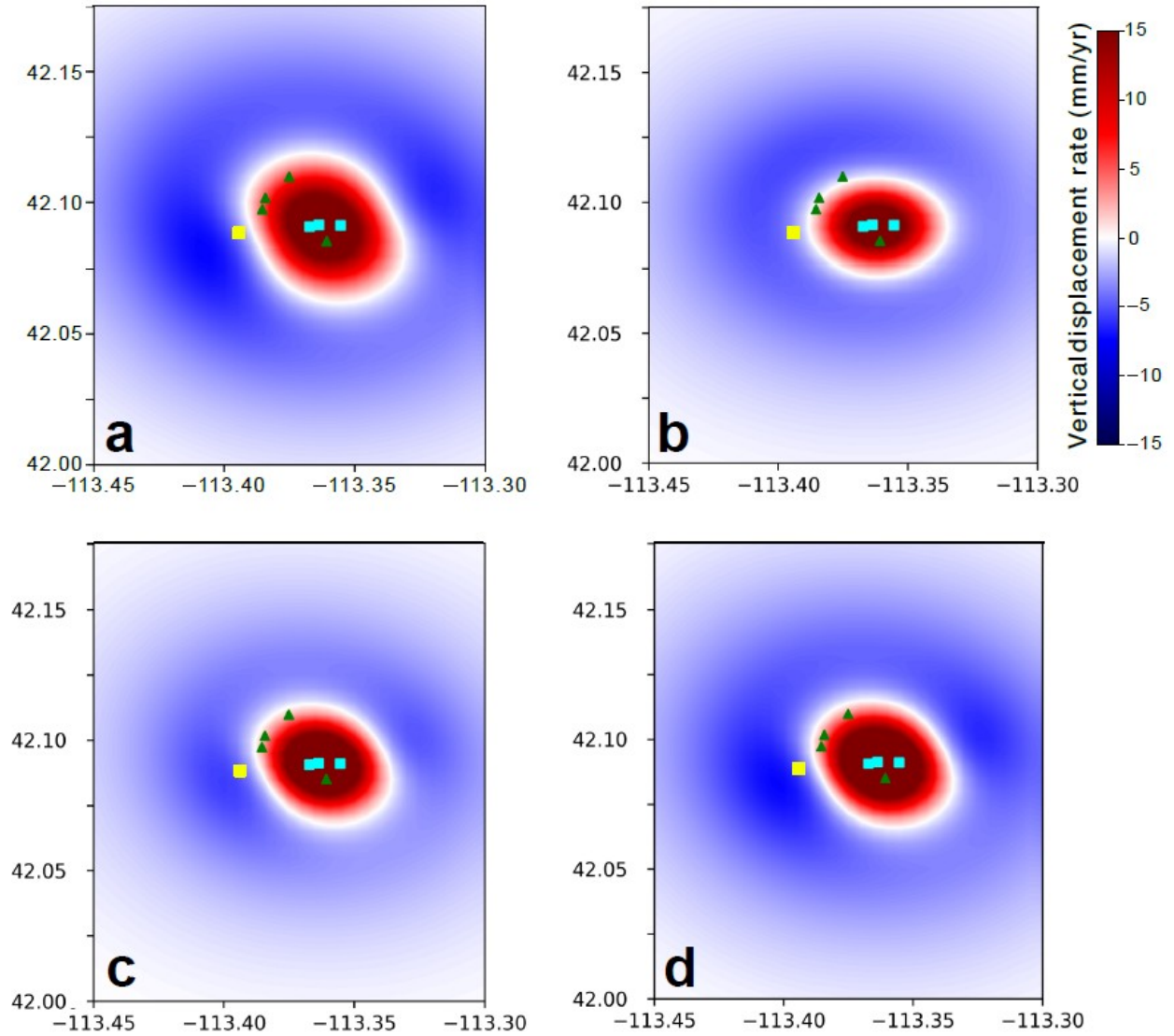


Figure S3: Comparison of modelled surface displacement from a) optimal model with anisotropy, b) isotropic model, c) model with injection reservoir permeability = $4.7 \times 10^{-13} \text{ m}^2$, production reservoir permeability = $4 \times 10^{-13} \text{ m}^2$, d) model with injection reservoir permeability = $7.1 \times 10^{-13} \text{ m}^2$, production reservoir permeability = $6 \times 10^{-13} \text{ m}^2$.

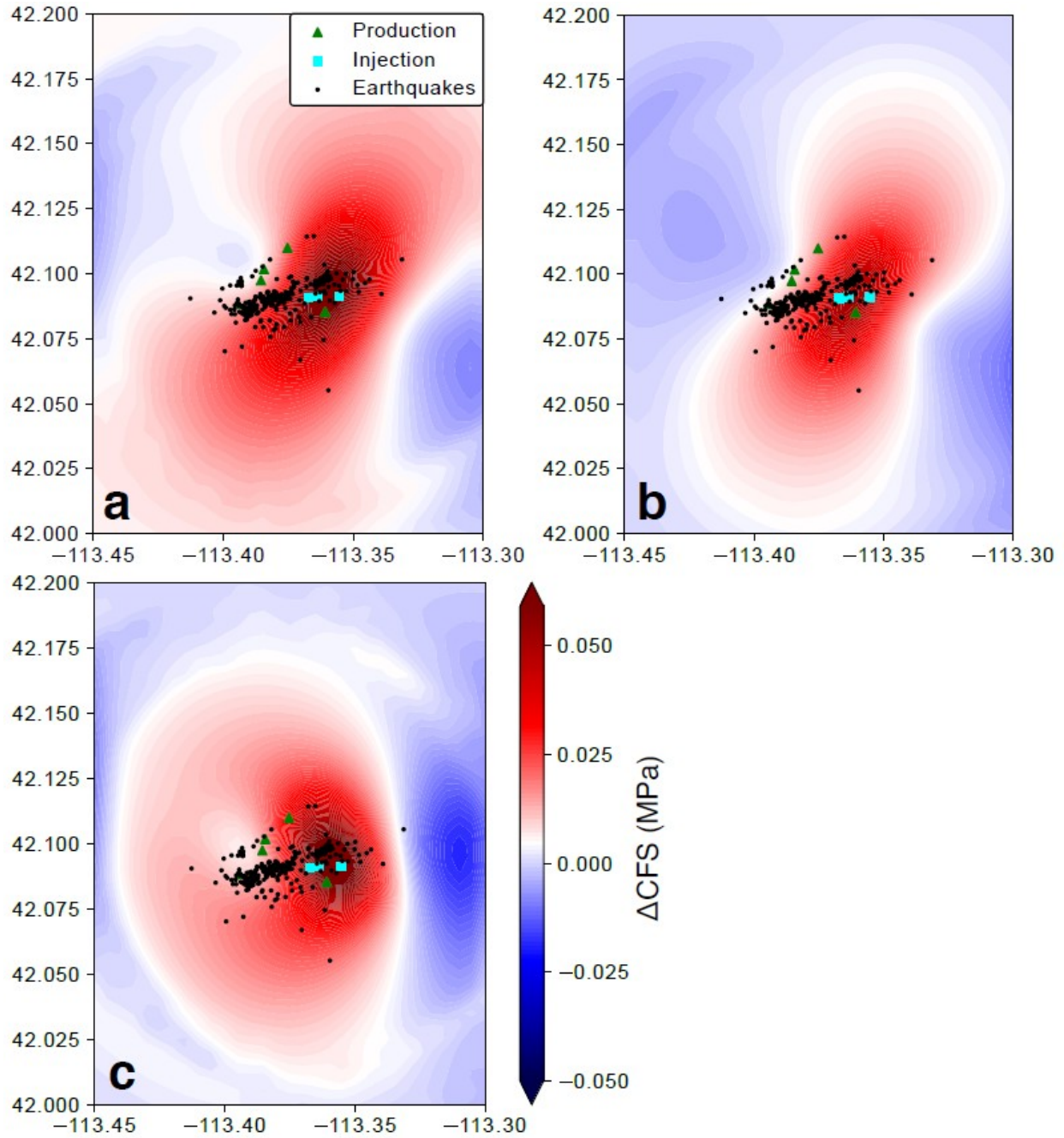


Figure S4: Comparison of effect of assumed fault plane (left-lateral N60E), a) shows model where CFS is calculated along the left-lateral N60E Narrows fault zone, b) model where CFS is calculated along left-lateral N-S striking faults, c) model where CFS is calculated along a normal-faulting N-S fault.