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**Linking macroscopic failure with micromechanical processes in layered rocks: How layer orientation and roughness control macroscopic behavior**

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## 1 **Abstract**

2 To constrain the impact of preexisting mechanical weaknesses on strain localization culminating  
3 in macroscopic shear failure, we simulate triaxial compression of layered sedimentary rock using  
4 three-dimensional discrete element method simulations. We develop a novel particle packing  
5 technique that builds layered rocks with preexisting weaknesses of varying orientations,  
6 roughness, and surface area available for slip. We quantify how the geomechanical behavior,  
7 characterized by internal friction coefficient,  $\mu_0$ , and failure strength,  $\sigma_F$ , vary as a function of  
8 layer orientation,  $\theta$ , interface roughness, and total interface area. Failure of the simulated  
9 sedimentary rocks mirrors key observations from laboratory experiments on layered sedimentary  
10 rock, including minima  $\sigma_F$  and  $\mu_0$  for layers oriented at  $30^\circ$  with respect to the maximum  
11 compressive stress,  $\sigma_1$ , and maxima  $\sigma_F$  and  $\mu_0$  for layers oriented near  $0^\circ$  and  $90^\circ$  to  $\sigma_1$ . The  
12 largest changes in  $\sigma_F$  (66%) and  $\mu_0$  (20%) occur in models with the smoothest interfaces and  
13 largest interface area. Within the parameter space tested, layer orientation exerts the most  
14 significant impact on  $\sigma_F$  and  $\mu_0$ . These simulations allow directly linking micromechanical  
15 processes observed within the models to macroscopic failure behavior. The spatial distributions  
16 of nucleating microfractures, and the rate and degree of strain localization onto preexisting  
17 weaknesses, rather than the host rock, are systematically linked to the distribution of failure  
18 strengths. Preexisting weakness orientation more strongly controls the degree and rate of strain  
19 localization than the imposed confining stress within the explored parameter space. Using the  
20 upper and lower limits of  $\mu_0$  and  $\sigma_F$  obtained from the models, estimates of the Coulomb shear  
21 stress required for failure of intact rock within the upper seismogenic zone (7 km) indicates that a  
22 rotation of  $30^\circ$  of  $\sigma_1$  relative to the weakness orientation may reduce the shear stress required for  
23 failure by up to 100 MPa.

24

25 **Keywords:** Anisotropy; preexisting weakness; layered rock; internal friction; failure strength;

26 discrete element method

27 **1. Introduction**

28 Natural rocks contain mechanical weaknesses that span several orders of magnitude in scale,  
29 from grain contacts to plate boundary faults. In particular, sedimentary basins host layers of  
30 sediments and sedimentary rocks at various stages of deposition, burial, diagenesis and  
31 lithification that may provide mechanical weaknesses along their contacts. Bedding-parallel  
32 fractures between strata (e.g., Gale et al., 2014), and bedding-perpendicular fractures that  
33 terminate at layer contacts (e.g., Pollard & Aydin, 1988) demonstrate that interfaces between  
34 sedimentary strata can act as mechanical weaknesses that influence stresses, localize strain and  
35 impact macroscopic failure.

36 However, many numerical models of crack growth and fault development assume  
37 homogeneous and isotropic host rock properties due, in part, to the scarcity of field and  
38 laboratory data that constrain precisely how preexisting weaknesses impact the macroscopic  
39 geomechanical behavior of the host rock. To constrain the influence of preexisting mechanical  
40 weaknesses on macroscopic failure, we execute series of triaxial compression tests on discrete  
41 element method simulations of layered sedimentary rock. We designed a new DEM layer  
42 construction technique in order to capture mechanical anisotropy that arises from differences in  
43 lithology and unconformities in layered sequences. We vary the layer orientation with respect to  
44 the maximum compression direction, the layer interface roughness, the total layer interface area  
45 available for slip, and the applied confining stress. We assess the impact of each parameter on  
46 the concentration of microscopic failure along the preexisting weaknesses relative to diffuse  
47 deformation throughout the host rock, and on the resulting macroscopic failure stress and internal  
48 friction. Although previous experiments have investigated the impact of layer orientation on  
49 failure strength (e.g., Duveau et al., 1998), this numerical analysis is the first to compare the

50 relative impact of each of the aforementioned parameters on failure behavior, and the first to  
51 investigate differences produced by layer interface roughness and area. The new layer  
52 construction technique is critical to this parameterization. Furthermore, we directly link the  
53 spatial distribution of microfracturing and strain localization to macroscopic geomechanical  
54 response, thus providing new insights not yet available experimentally.

## 55 **2. Influence of mechanical weaknesses on failure**

56 Due to the prevalence of materials containing mechanical weaknesses, many experimentalists  
57 have worked to understand how mechanical weaknesses impact rock failure and elastic  
58 properties (e.g., Duveau et al., 1998). Many experiments have focused on the peak failure  
59 strength of materials (e.g., Donath, 1961, 1964; Nova and Zaninetti, 1990; Shea and Kronenberg,  
60 1993; Duveau et al., 1998; Cho et al., 2012; Fjær and Nes, 2014). For example, increasing mica  
61 content in foliated gneiss decreases the compressional strength because biotite grains provide  
62 nucleation sites for tensile microcracks (Rawling et al., 2002). Similarly, compression tests on  
63 Mancos shale indicate that bedding planes are weak relative to the host rock and tend to fail  
64 preceding macroscopic failure (Fjær and Nes, 2014). Here, we aim to capture differences in  
65 mechanical behavior that arise in layered sedimentary rock.

66 Internal friction is an empirical term that experimentalists identify from the slope of linear  
67 regression fits through experimental measurements of the stress conditions at or immediately  
68 preceding failure (e.g., Byerlee, 1978). The internal friction and peak failure stress provide  
69 estimates of the stress state at which rocks fail, and so are critical in robust predictions of brittle  
70 failure within intact material at varying crustal conditions. Although many experiments have  
71 identified relationships between the orientation of preexisting mechanical weaknesses and failure  
72 stress (e.g., Shea and Kronenberg, 1993; Tavallali and Vervoort, 2010), few have attempted to

73 constrain the impact of planar mechanical weaknesses on the internal friction of the host rock  
74 (e.g., Donath, 1961; Duveau et al., 1998). This gap in understanding arises from the necessity of  
75 breaking multiple rock cores at varying confining stresses in order to identify a relationship  
76 between an applied confining stress and resulting failure stress, and so estimate internal friction.  
77 Consequently, to robustly constrain internal friction and hence predict the conditions of brittle  
78 rock failure at depth, experimentalists must use rock samples that are sufficiently similar to each  
79 other so that the suite of experiments at varying confining stresses mimic the same characteristic  
80 rock core. In addition, to characterize how microstructures are evolving and localizing with  
81 accumulated strain requires labor-intensive serial experimentation in which tests on similar rock  
82 cores are stopped at systematic strain increments (e.g., Mair et al., 2000). These tasks become  
83 increasingly challenging when focusing on rocks with well-developed mechanical anisotropy.

84 In contrast to laboratory experiments, numerical simulations allow the deformation of  
85 identical simulated rock containing mechanical weaknesses under a range of loading conditions.  
86 Consequently, the natural variability between individual rock cores that often plague  
87 experimental work does not have a strong influence on resulting geomechanical behavior in  
88 numerical models. Furthermore, numerical methods enable systematic comparison of mechanical  
89 properties of material with differing expressions of heterogeneity (e.g., Hentz et al., 2004;  
90 Belheine et al., 2009; Scholtès & Donzé, 2012, 2013; Dinç & Scholtès, 2018), such as layers  
91 with differing orientations and roughness, as in this study. Numerical models provide new  
92 insights into how evolving microstructures control macroscopic behavior (e.g., Schöpfer et al.,  
93 2009) that are generally not available in situ from laboratory experiments, unless the  
94 experimentalists use techniques such as recording acoustic emissions (e.g., Stanchits et al., 2006)  
95 or acquiring tomograms (e.g., Renard et al., 2018), from which they infer the evolving fracture

96 network. Post-deformation procedures required after laboratory triaxial experiments, such as  
97 unloading and epoxy impregnation for microscopic analyses, may alter or overprint the  
98 microstructures. These procedures are not necessary for assessing microstructural evolution  
99 within numerical models, and so deciphering such microstructural artifacts is not necessary.

### 100 **3. Methods**

101 To constrain the impact of preexisting mechanical weaknesses on macroscopic  
102 geomechanical properties, we simulate triaxial compression of layered sedimentary rock using  
103 the discrete element method modeling tool ESyS-Particle. We briefly introduce the underlying  
104 physics of this tool. Then we describe the details of the models used in this study, including the  
105 model loading conditions, model microparameters, calibration, and a novel particle packing  
106 technique to construct the sedimentary layers.

#### 107 **3.1. ESyS-Particle**

108 We triaxially compress simulated layered sedimentary rock using the parallel 3D discrete  
109 element method (DEM) simulation package ESyS-Particle (Abe et al., 2003). Similar to other  
110 DEM approaches (e.g., Cundall and Strack, 1979), ESyS-Particle simulates rock with many  
111 individual spherical particles that are initially connected by elastic bonds that may fail following  
112 a tensile criterion or the Coulomb shear failure criterion. The underlying physics implemented in  
113 ESyS-Particle and other DEM implementations, such as YADE, are similar, although details of  
114 the packing algorithms, contact laws and failure criteria differ.

115 ESyS-Particle simulations of fault gouge production produce realistic evolutions of fault  
116 gouge size and sliding friction (Abe and Mair, 2005, 2009; Mair and Abe, 2008). The 3D  
117 implementation of ESyS-Particle enables out-of-plane motion, which has proven important to  
118 fault gouge production (Hazzard and Mair, 2003; Abe and Mair, 2005; Mair and Hazzard, 2007).

119 These DEM simulations provide additional information beyond that available from laboratory  
120 experiments, such as directed force networks, at fine spatiotemporal resolution throughout  
121 deformation (e.g., Mair and Hazzard, 2007).

### 122 **3.2. Construction of layered rock**

123 To simulate triaxial compression tests of layered sedimentary rock using ESyS-Particle, we  
124 build particle assemblages containing layers that are separated by preexisting weaknesses,  
125 representing layered sedimentary rock. We build sample geometries of blocks (cuboids) with  
126 length to width ratio 2:1 and cubes (ratio 1:1). We investigate both cubes and blocks because the  
127 model shape influences the total layer interface area available for slip, and in particular, how  
128 many bonds connect particles within layers (i.e., host rock matrix) and between layers (i.e.,  
129 interfaces) for each layer orientation. Comparing the results from these sets of models highlights  
130 the influence of the total layer interface area available for slip on rock failure. The dimensions of  
131 the cubes are 20 mm, while the dimensions of the rectangular blocks are 20 mm, 20 mm and 40  
132 mm, with the long axis oriented vertically, parallel to  $\sigma_1$  (Fig. 1). The model dimensions  
133 constrain the choice of layer thickness (5 mm). This thickness allows the macroscopic failure  
134 behavior to be independent of the specific particle packing geometry of one or two layer  
135 interfaces because models include at least 4 layers. Here, we do not assess the influence of layer  
136 thickness on failure behavior because this influence likely scales with the model volume, and so  
137 may not yield significant insights into crustal deformation. In particular, the failure of a larger  
138 model with thicker layers may be similar to the failure of a smaller model with thinner layers if  
139 the total interface area available for slip are similar. In order to assess the influence of total  
140 interface area of failure behavior, we change the shape of the model rather than the thickness of  
141 the layers.



142 To assess the influence of preexisting weaknesses on internal friction, we vary the orientation  
143 of layers, and keep the direction of maximum compression constant (vertical). We measure layer  
144 orientation,  $\theta$ , as the clockwise angle from the top side of the model to the layer interface (Fig.  
145 1), which is also the angle between  $\sigma_1$  and the normal to the layer interface. Horizontal layers  
146 have  $\theta=0^\circ$ , and vertical layers have  $\theta=90^\circ$ . The layers are parallel in the z-dimension, which is  
147 the out of plane direction.

148 We develop a novel particle packing technique in order to build layers of varying interface  
149 roughness. We construct polygonal volumes and then fill the volumes with spherical particles  
150 with radii of 0.1 mm to 1.0 mm (Fig. S1). We fill the volumes with particles starting from the  
151 bottom volume and working upward, or in the case of vertical layers, from left to right. We fill  
152 each volume using a standard particle packing technique of ESyS-Particle that has produced  
153 DEM models that match the macroscopic behavior of brittle elastic materials. Then we connect  
154 neighboring particles inside each layer with bonds, as well as the particles between each layer.  
155 The variability in particle packing, and hence porosity, across layer interfaces are small. In order  
156 to capture differences in mechanical strength along layer interfaces, we set the cohesion of bonds  
157 within layers (i.e., host rock) to 20 MPa and set the cohesion of bonds between layers (i.e.,  
158 preexisting weaknesses) to 10 MPa. Calibration of the numerical failure strengths to  
159 experimental strengths constrain the cohesion of bonds within the layers. The precise ratio of the  
160 strength of the host rock and interfaces remains one of the least constrained by experimental  
161 data. In addition, the effective strength of the interfaces arises from both the chosen cohesion and  
162 particle packing across layer interfaces, as discussed below.

163 In ESyS-Particle, the bond tensile strength is determined from the microparameter Mohr-  
164 Coulomb criterion constructed from the bond internal friction and cohesion. Extension of the

165 criterion into the tensile normal stress regime determines the bond tensile strength. ESyS-Particle  
166 allows the application of a truncation factor to reduce the tensile strength from that predicted by  
167 the Mohr-Coulomb criterion, but we did not employ this factor here. Consequently, the  
168 advantage of parameterizing the cohesion rather than a different microparameter is that doing so  
169 changes both the tensile and shear failure criterions. The microparameters of bonds within each  
170 layer are identical. The bonds within layers are stronger than the bonds between layers, and are  
171 subsequently referred to as strong and weak bonds, respectively. The lack of employed  
172 truncation factor may produce larger tensile macroscopic strengths than natural sedimentary  
173 rocks, and so amplify the influence of shear failure relative to tensile failure.

174 To control the initial roughness of the layer interfaces (Fig. 2), we change the potential  
175 spatial overlap of the adjacent layers (Fig. S1). This overlap parameter specifies how many  
176 millimeters by which the boundaries of neighboring polygonal volumes overlap. With an overlap  
177 of 1 mm, for example, the vertical position of the bottom of a horizontal layer is 1 mm lower  
178 than the vertical position of the top of the previous (lower) horizontal layer (Fig. S1). With  
179 increasing overlap, particles are more closely packed along layer interfaces, and produce greater  
180 roughness (Fig. S1, Fig. 2). The bottom surface of each layer interface is smoother than the top  
181 surface because we pack the models starting from the bottom of the model (Fig. S1, Fig. 2).

182 A key question is whether the effective strengths of the simulated layer interfaces are  
183 comparable to the strengths of layer interfaces in natural sedimentary strata, or other mechanical  
184 weaknesses found in the crust. Both the bond cohesion and packing geometry along layer  
185 interfaces influence the effective strength of the layer interface. However, the packing geometry  
186 appears to exert a stronger influence than the bond cohesion. With zero grain overlap and no  
187 applied confining stress, some models fail immediately after the particles experience

188 gravitational forces because the particles do not geometrically interlock across the layer  
189 interfaces. This lack of interlocking produces exceptionally smooth surfaces that provide little  
190 resistance to gravity.

191 The slip-parallel and slip-perpendicular root-mean-squared roughness,  $\chi_{\text{RMS}}$ , of slip surfaces  
192 acquired from white light interferometer measurements (Renard et al., 2012) constrain the  
193 potential range of  $\chi_{\text{RMS}}$  of intact sedimentary interfaces (Fig. S2). Although the  $\chi_{\text{rms}}$  of intact  
194 interfaces are likely higher than the  $\chi_{\text{RMS}}$  of slipped surfaces, we expect that the slip-  
195 perpendicular and slip-parallel roughness are on the same order of magnitude of the intact  
196 interfaces. For example, in clay-rich sandstone and shales with a mean grain size,  $G$ , the finest  
197 roughness is expected on to be on the scale of approximately  $0.5G$ . However, there may be  
198 random pitting on the order of a few millimeters due to local differential compaction or  
199 displacements of grains during sedimentation. In the numerical models, we measure  $\chi_{\text{RMS}}$  by  
200 identifying the layers of particles that connect adjacent layers, rotating the exposed layer contacts  
201 so that they trend horizontal, and finding the elevation of each particle from the particle radius  
202 and the y-coordinate (vertical) of the particle centroid. The resulting surface of particle  
203 elevations reflects the roughness of the layer contact. The overlap distances of 0.2 mm and 0.5  
204 mm produce layer interfaces with  $\chi_{\text{RMS}}$  that overlap the ranges of the laboratory measurements of  
205 slip-perpendicular and slip-parallel  $\chi_{\text{RMS}}$  (Fig. S2).

206 With this particle packing technique, the particle radii range (0.1-1.0 mm) limits the  
207 maximum  $\chi_{\text{RMS}}$  achievable in the models, similar to the grain size in sedimentary rock. When the  
208 overlap is greater than 0.5 mm, the  $\chi_{\text{RMS}}$  remains relatively constant because increasing the  
209 overlap does not allow denser particle packing between layers with the selected particle radii

210 range. Despite these constraints, the  $\chi_{\text{RMS}}$  produced along the numerical layer interfaces  
211 compares favorably with physical measurements of  $\chi_{\text{RMS}}$ , lending confidence to the ability of the  
212 models to capture the onset of macroscopic failure in layered sedimentary rock. These estimates  
213 of roughness with  $\chi_{\text{RMS}}$  may be used to estimate the corresponding joint roughness coefficient  
214 (JRC) using empirical statistical relationships between JRC and  $\chi_{\text{RMS}}$  (e.g., Tse & Cruden, 1979).

215 This particle packing technique produces models with porosities that differ by <1-2%. The  
216 porosity of models with layers with both overlap values range from 24-25%, and models with no  
217 layers have 23% porosity. Consequently, the variability in porosities between models is  
218 analogous to natural variability.

219 Previous numerical studies have assessed anisotropy with DEM models using numerical  
220 objects that behave as joints (e.g., Scholtès and Donzé, 2012). One central difference between  
221 our implementation of anisotropy and these methods is that our approach enables modifying the  
222 roughness of preexisting weaknesses. Consequently, our approach is more applicable to  
223 sedimentary rocks constructed from the sediment deposition in which sediments and clays  
224 gravitationally settle on top of older sediments, rather than jointed rock masses, for example.

### 225 **3.3. Calibration**

226 To simulate laboratory triaxial compression tests, we first apply linearly increasing confining  
227 stress, from zero to the desired stress, on each of the six sides of the model such that  $\sigma_1=\sigma_2=\sigma_3$ .  
228 Next, we displace the top and bottom sides synchronously at a constant velocity (0.125 mm/s)  
229 toward the center of the model, increasing  $\sigma_1$  while maintaining  $\sigma_2=\sigma_3$ . Once the maximum  
230 desired loading velocity is reached, we continue to apply this velocity for several thousand time  
231 steps until after the sample fails.

232 The low applied velocity, linear ramp of the confining stress and loading velocity, and the  
233 symmetrically loading of the top and bottom edges, enhances stability of the particle assemblage  
234 by ensuring quasi-static conditions. In addition to these precautions, we calculate an appropriate  
235 model time step length following the Courant condition (Courant et al., 1928), where the  
236 numerically stable time step,  $d_t$ , is related the minimum particle mass,  $M_{min}$ , and maximum  
237 bond stiffness,  $K_{max}$ , as

$$238 \quad d_t < 0.1 \sqrt{\frac{M_{min}}{K_{max}}} \quad \text{Eq. 1}$$

239 Systematic tests conducted with varying bond and particle parameters (Table S1) produce  
240 uniaxial compressive strengths (40-120 MPa) within the range of natural layered shale (e.g., Cho  
241 et al., 2012).

242 Table S1 shows the values of microparameters that were constrained by careful calibration.  
243 Pairs of bonded and unbonded particles have frictional and elastic interactions. We calculate the  
244 corresponding particle density using the initial porosity of the model,  $\phi$  (25%), and a desired bulk  
245 density of 2700 kg/m<sup>3</sup>,  $\rho$ , such that the particle density is  $\rho(1-\phi)$ . We then follow the established  
246 numerical technique of increasing the particle density by a factor of 10<sup>6</sup>, which enables larger  
247 time step lengths and thus shorter run times. Following the Courant condition (Eq. 1), the  
248 minimum particle radius and maximum bond stiffness determine the time step length. The ramp  
249 up times are sufficiently long to produce stable models in which the total kinetic energy does not  
250 increase unbounded. Particles interact with the walls that apply the constant velocity or force  
251 boundary conditions with elastic interactions following the prescribed stiffness, and without  
252 frictional interactions. The tensile strength of the bonds is determined by extrapolation of the  
253 Mohr-Coulomb failure criterion using the bond microparameters of internal friction and  
254 cohesion. The microparameters of the bonded and unbonded particles are not expected to equal

255 physical values of those properties. Instead, we calibrate the microparameters to produce bulk  
256 macroscopic properties of the models that are within the range of physical measurements.

257 The failure of these simulated sedimentary rocks mirrors key observations from laboratory  
258 experiments, including: failure envelopes that decrease in slope at higher confining stresses,  $\sigma_2$ ,  
259 broadening loading curves near peak stresses at higher  $\sigma_2$ , and smaller stress drops at higher  $\sigma_2$ .  
260 Similarly consistent with laboratory experiments,  $\sigma_F$  and  $\mu_0$  are minimized for layers oriented at  
261  $30^\circ$  with respect to  $\sigma_1$ , and maximized for layers oriented near  $0^\circ$  and  $90^\circ$  to  $\sigma_1$ . These  
262 observations provide further evidence of robust calibration, and applicability of the numerical  
263 results to crustal behavior. These observations are discussed in greater detail in the next section.

264 Furthermore, these loading conditions, microparameters and particle packing technique  
265 produce models with bulk geomechanical responses that are not sensitive to location of  
266 individual particles (Fig. S3). In particular, the stress-strain curves of models that differ only in  
267 the location of initial seed points, which determine the random packing of particles, match along  
268  $>90\%$  of their length preceding macroscopic failure, have comparable means and magnitudes of  
269 fluctuations after failure, and produce similar failure stresses (Fig. S3).

270 The numerical models employed here benefit from several years of software development  
271 and benchmark calibration (e.g., Weatherley et al., 2010; Schopfer et al., 2009; Mair and Abe,  
272 2009). Consequently, we selected several model parameters, such as the ratio of the minimum to  
273 maximum particle radii (0.1/1.0), using results from previous calibrations that produce model  
274 behaviors that closely match the behavior of linear elastic brittle materials.

### 275 **3.4. Internal friction derivation**

276 To constrain the macroscopic internal friction,  $\mu_0$ , of each simulated layered sedimentary  
277 rock, we execute triaxial compression tests at increasing confining stress,  $\sigma_2 = \sigma_3$ . We test  $\sigma_2$

278 from 0-50 MPa in models with differing layer orientations (from horizontal to vertical layers),  
279 differing layer interface roughness (0.2 mm or 0.5 mm overlap) and differing total layer interface  
280 area (cube or block models), requiring more than 256 unique model runs (Table S.2). In order to  
281 compare the geomechanical responses of layered rock to more homogeneous rocks that do not  
282 contain layers, and so assess when the impact of layers exerts a significant control on failure  
283 behavior, we repeat this analysis on homogeneous block models with no layers.

284 At each applied  $\sigma_2$ , we find the peak failure stress,  $\sigma_F$ . Rearranging the Coulomb shear failure  
285 criterion in terms of the principal stresses and uniaxial compressive strength,  $S_0$ , provides a  
286 relationship for the internal friction angle,  $\varphi$  (e.g., Jaeger et al., 2007):

$$287 \quad \sigma_F = S_0 + \sigma_2 \tan^2 \left( \frac{\pi}{2} + \frac{\varphi}{2} \right). \quad \text{Eq. 2}$$

288 We find the slope of the linear regression through  $\sigma_2$  and  $\sigma_F$  of the models to calculate  $\varphi$ . We  
289 report internal friction as the friction coefficient,  $\mu_0 = \tan \varphi$ .

## 290 **4. Results**

291 First, we describe characteristic loading curves produced by the simulated rock (Fig. 3). We  
292 analyze the distribution of  $\sigma_F$  and  $\mu_0$  with respect to the applied confining stress,  $\sigma_2$ , and layer  
293 orientation,  $\theta$ , in models with block and cube geometries. We show how strain localizes as the  
294 models deform by presenting spatial distributions of particle velocities and nucleating fractures,  
295 and the difference in the percentage of fractures that form along the preexisting weaknesses and  
296 within the host matrix.

### 297 **4.1. Stress-strain relationships**

298 Typical loading curves from the numerical simulations share several characteristics with  
299 laboratory experiments (Fig. 3). Consistent with triaxial compression experiments, we observe 1)  
300 increasing failure stress,  $\sigma_F$ , with increasing  $\sigma_2$  (e.g., Mogi et al., 1967), 2) broadening of the

301 loading curve with approaching macroscopic failure with increasing  $\sigma_2$  (e.g., Niandou et al.,  
302 1997), 3) decreasing stress drop with increasing  $\sigma_2$  (e.g., Klein et al., 2001), and 4) decreasing  
303 slope of the failure envelope with increasing  $\sigma_2$  (e.g., Byerlee, 1978) (Fig. 3). The decreasing  
304 slope of the failure envelope with increasing  $\sigma_2$  may arise from the initial compaction of the  
305 model preceding axial displacement loading, as the initial porosity is 24-25%. These models do  
306 not produce a clear transition from brittle to ductile behavior up to 50 MPa confining stress. This  
307 transition could occur at higher confining stresses, but as this study focuses on brittle failure, we  
308 do not assess this possibility. This transition likely depends on the ratio of the normal and shear  
309 stiffness of the bonds in DEM simulations.

310 Calculating the linear best-fit through the failure envelope of principal stresses ( $\sigma_F$  and  $\sigma_2$ )  
311 produces values of  $R^2 > 0.95$  for all of the models, lending confidence to the  $\mu_0$  estimates that we  
312 derive from the linear regression through the full range of  $\sigma_2$ . This linearity, and resulting high  
313  $R^2$  values are consistent with the  $R^2$  values (0.90-0.99) of linear regressions of experimental  
314 failure envelopes of shale produced in direct shear tests (Heng et al., 2015). However, because  
315 previous work (e.g., Byerlee, 1978) as well as our data indicates that the slope of the failure  
316 envelope decreases at higher  $\sigma_2$ , we calculate  $\mu_0$  using linear regressions through the failure  
317 envelope for the subsets  $\sigma_2=0-20$  MPa, and  $\sigma_2=20-50$  MPa, as well as  $\sigma_2=0-50$  MPa (Figs. S.4-  
318 S.5).

319 The curvature of the failure envelope from 0-20 MPa, in particular, suggests that estimates of  
320 internal friction using data from this range will underestimate friction at the lower end of this  
321 range. However, the relatively high  $R^2$  values suggest that the difference between the true and  
322 apparent internal friction will be small.

## 323 **4.2. Impact of layer orientation on macroscopic geomechanical behavior**



324 The applied confining stress,  $\sigma_2$ , layer orientation,  $\theta$ , and overlap distance control the peak  
325 failure stress,  $\sigma_F$  (Fig. 4). Consistent with laboratory experimental studies (e.g., Donath, 1961;  
326 Duveau et al., 1998),  $\sigma_F$  is lowest when  $\theta$  is  $60^\circ$ , and maximized at  $90^\circ$  and  $0-15^\circ$  (Fig. 4). For  
327 each applied  $\sigma_2$ , the range of  $\sigma_F$  as a function of orientation is slightly greater in the block models  
328 than the cube models (Fig. 4). This result arises because the block models have higher layer  
329 interface area than the cube models. Varying the orientation of the layers therefore has a greater  
330 impact on  $\sigma_F$  in the block models because they have larger ratios of the number of weak bonds to  
331 strong bonds than the cube models. The range of  $\sigma_F$  is larger in models with smoother layer  
332 interfaces (0.2 mm overlap) than in models with rougher layer interfaces. We expect that the  
333 influence of layer orientation on failure will be magnified when the layer interfaces are smoother  
334 compared to when they are rougher. When the layer interfaces are rougher, they function more  
335 similarly to the host matrix rather than mechanical weaknesses. Notably, the  $\sigma_F$  for each  $\sigma_2$  of  
336 models with horizontal and vertical layers are almost identical to that of the homogeneous block  
337 models.

338 Due to the steeping of the failure envelopes at lower  $\sigma_2$  (Fig. 3), we determine  $\mu_0$  using the  
339 full  $\sigma_2$  range (0-50 MPa), as well as lower (0-20 MPa) and higher (20-50 MPa) ranges (Fig. S4-  
340 S5). As expected,  $\mu_0$  calculated from the lower  $\sigma_2$  range (red in Fig. 5) is larger than the upper  $\sigma_2$   
341 range (blue in Fig. 5), while the estimates derived from the full range sit between those extremes  
342 (Fig. S4-S5, black in Fig. 5). In the block models, the distribution of  $\sigma_F$  produces similar values  
343 of  $\mu_0$  to cube models, with minima at  $\theta=60^\circ$ , i.e., at  $30^\circ$  with respect to  $\sigma_1$  (Fig. 5). The range of  
344  $\mu_0$  is larger in the model with smooth than rough layer interfaces (Fig. 5).

345 In general, the homogeneous models produce estimates of  $\mu_0$  that closely match estimates  
346 from models with horizontal and vertical layers (Fig. 5). At confining stresses  $<20$  MPa, the

347 presence of layers reduces  $\mu_0$  from that of more homogeneous rock only when  $\theta=30^\circ-60^\circ$ . At  
348 higher confining stresses, the layers produce  $\mu_0$  that differs from the homogeneous models when  
349  $\theta=0^\circ-60^\circ$ .

350 The cube models display a smaller range of  $\mu_0$  values than in the block models (Fig. 5),  
351 consistent with trend in  $\sigma_F$  described above, and can similarly be attributed to the reduced  
352 interface area in the cube models relative to the block models. Some trends in the distribution of  
353  $\mu_0$  with respect to  $\theta$  are similar between the block and cube models, including the maxima at  $75^\circ$ ,  
354 and minima at  $60^\circ$ . However, whereas the  $\mu_0$  minimum occurs only at  $60^\circ$  in the block models,  
355 and in the cube models with smooth interfaces (0.2 mm overlap); in the rougher cube models,  $\mu_0$   
356 is minimized when  $\theta$  is  $0^\circ$ ,  $30^\circ$  and  $60^\circ$  (Fig. 5).

357 To investigate whether the anomalously high  $\mu_0$  for models with  $\theta=75^\circ$  arises from numerical  
358 artifacts, we calculate  $\mu_0$  for block models oriented at  $\theta=70^\circ$  and  $\theta=80^\circ$  because these angles  
359 bracket  $\theta=75^\circ$ , for both smooth (0.2 mm overlap) and rough (0.5 mm overlap) interfaces. We  
360 find that the resulting  $\mu_0$  estimates when  $\theta=70^\circ$  and  $\theta=80^\circ$  similarly bracket this value at  $\theta=75^\circ$   
361 (Fig. S6). This distribution of  $\mu_0$  suggests that the high  $\mu_0$  at  $\theta=75^\circ$  is not an artifact of the model  
362 set up, but reflects the magnified impact of  $\sigma_2$  on  $\sigma_F$  at lower  $\sigma_2$  compare to that impact at higher  
363  $\sigma_2$  for these steeper orientations ( $70-90^\circ$ ). This heightened sensitivity of  $\sigma_F$  to  $\sigma_2$  produces steeper  
364 slopes in the failure envelopes over the full  $\sigma_2$  range, and particularly from  $\sigma_2=0-20$  MPa, which  
365 produces higher  $\mu_0$  when  $\theta=70-90^\circ$  (Fig. S6). As the layer orientation steepens from  $60^\circ$  to  $80^\circ$ ,  
366  $\sigma_F$  at each tested confining stress gradually increases (Fig. S6). However, when the layer  
367 orientation steepens from  $80^\circ$  to  $90^\circ$ ,  $\sigma_F$  at confining stresses  $<20$  MPa increase by larger  
368 magnitudes than those increases from  $60^\circ$  to  $80^\circ$ . This sudden jump suggests that the results at  
369  $90^\circ$  are more anomalous than those at  $75^\circ$ . In other words, if the  $\sigma_F$  under lower confining

370 stresses (<20 MPa) at 90° more closely matched those at 80°, then the trend in internal friction  
371 would more closely match expectations: gradually increasing from 60° to 90°. The applied  
372 microparameter tensile strength may have produced this anomalous result. Lower tensile strength  
373 would promote failure along planes orientation parallel to  $\sigma_1$  (at 90°), producing lower  $\sigma_F$  at  
374 lower confining stresses and thus higher internal friction coefficients.

375 Similarly, Cho et al. (2012) found overlapping values of uniaxial compressive strength when  
376  $\theta=75^\circ$  and  $\theta=90^\circ$  in laboratory tests on layered shale. The difference in layer orientation did not  
377 appear to influence the orientation of system-spanning fractures in these experiments, with both  
378 tend to trend parallel to  $\sigma_1$ . In our numerical simulations, the steepening of layers by 15° toward  
379  $\sigma_1$  do not significantly increase the failure strength at higher confining stresses (>30 MPa), but  
380 do lead to larger increases in strength at lower confining stresses (<30 MPa). This difference in  
381 behavior likely arises from the ability of the cores to fail via axial splitting along fractures  
382 trending vertical to  $\sigma_1$  (promoted under lower confining stresses), or along more-obliquely  
383 oriented fractures (promoted under higher confining stresses).

384 Comparing the magnitudes of  $\mu_0$  produced in models with each of the assessed parameters  
385 held constant reveals the relative impact of each individual parameter (Fig. 6, Fig. S7). Models  
386 with the largest interface area (blocks) and the smoothest layers (0.2 mm) produce the largest  
387 changes in  $\mu_0$  (Fig. 6A). In general, smoother interfaces promote slightly lower values of internal  
388 friction than rough interfaces, with the largest variations when layers are oriented at  $\theta=45^\circ$  and  
389  $60^\circ$  (Fig. 6B, D). Internal friction values are similar for cubes (with lower interface area) and  
390 blocks (with higher interface area) except for layers oriented at  $\theta=60^\circ$  and  $75^\circ$ , where  $\mu_0$  for the  
391 blocks and cubes diverge the most (Fig. 6C, D). Varying the layer orientation produces the  
392 largest  $\Delta\mu_0$  compared to varying the layer interface roughness or model shape (Fig. 6A, D).

393 Varying the shape of the model (cube or block) produces the smallest changes in  $\mu_0$  relative to  
394 the layer orientation and layer roughness (Fig. 6C, D).

395 The distribution of elastic modulus relative to the layer orientation produced in these  
396 numerical models are consistent with laboratory experiments on layered shale (Cho et al., 2012).  
397 In both these numerical models (Fig. S8) and experiments, the effective elastic modulus  
398 increases as the orientation of layers become increasingly parallel to  $\sigma_1$ .

### 399 **4.3. Linking microstructural deformation to macroscopic behavior**

400 To understand how the preexisting weaknesses influence the location and organization of  
401 microscopic failure, we show the spatial distribution of particle velocities (Fig. 7) and nucleating  
402 fractures (Fig. 8) as the simulated rock begins to fail. In these models, the bonds that break in  
403 each time step are analogous to nucleating or growing fractures in natural rock, and so we refer  
404 to them as nucleating fractures. Similarly, just as microfractures coalesce to form macroscopic  
405 faults in natural rocks, many bonds may break in clusters and thus form through-going faults.  
406 Particle velocities reveal structural reorganization within the rock at a micro- and mesoscopic  
407 scale. We focus on block models with 0.2 mm overlap because these models produce the largest  
408 variation in geomechanical behavior as the layer orientation changes. We report results from two  
409 representative confining stresses (0 MPa, 10 MPa) in models with end-member layer orientations  
410 ( $\theta=0^\circ$ ,  $90^\circ$ ), and the orientation that produces the lowest  $\sigma_F$  and  $\mu_0$  in the block models,  $\theta=60^\circ$ .

411 In models with horizontal layers ( $\theta=0^\circ$ ), and no confining stress, early in the experiment, the  
412 spatial distributions of particle velocities (Fig. 7A, Animation S1) and fractures (Fig. 8A,  
413 Animation S1) indicate that the weaker layer interfaces accommodate more deformation than  
414 within the layers, and later deformation spreads to the host matrix. Initially, the upper layer  
415 concentrates deformation, and then as the lower layer begins to break, bond breakage penetrates

416 this lower layer in a diffuse volume that is bounded by inclined planes (Fig. 8A). At higher  
417 confining stress (10 MPa), the spatial distribution of particle velocities (Fig. 7D, Animation S2)  
418 and fractures (Fig. 8D, Animation S2) reveal that deformation is more equally distributed  
419 throughout the host matrix. Deformation appears to be localized onto the weak bonds between  
420 layers only early in the experiment, whereas after 0.003 of axial strain, bonds break throughout  
421 the model apparently irrespective of the location of the weaknesses (Fig. 8D). After this axial  
422 strain, the fractures align into inclined pseudo-planar volumes. The confining stress appears to  
423 suppress the influence of the weak structure. The deformation patterns produced under no and 10  
424 MPa confining stress resemble macroscopic failure produced by the propagation of a through-  
425 going fault.

426 In models with layers oriented at  $\theta=60^\circ$  under zero or no confining stress, the spatial  
427 distributions of particle velocities (Fig. 7B, Animation S3) and fractures (Fig. 8B, Animation S3)  
428 indicate that a subset of the layer interfaces preferentially accommodate slip throughout much of  
429 the experiment. The few dominantly active interfaces are separated by several intermediate  
430 passive layers, causing the rock to fail as if it had fewer and thicker layers. However, velocity  
431 gradients within the emergent layers indicate that slip along the interfaces does not accommodate  
432 all of the deformation and some damage is located within the host (Fig. 7B). Early in the  
433 simulation, fractures form along all of the preexisting layer interfaces, whereas with continued  
434 strain, slip localizes onto only a few of the available slip surfaces (Fig. 8B, Animation S3). The  
435 observed strain localization onto a portion of the available surfaces suggests that the thickness of  
436 preexisting layers (i.e., the total layer interface area) does not exert a primary control on strain  
437 localization and the resulting geomechanical behavior when  $\theta=60^\circ$ . Similarly, at higher  
438 confining stress (10 MPa), the spatial distributions of particle velocities (Fig. 7E, Animation S4)

439 and fractures (Fig. 8E, Animation S4) indicate that early in the experiment, weak bonds between  
440 layers preferentially localize deformation, but after 0.00103 axial strain, deformation localizes  
441 onto only a few interfaces.

442 In models with vertical layers ( $\theta=90^\circ$ ) under no confining stress, the spatial distributions of  
443 particle velocities (Fig. 7C, Animation S5) and fractures (Fig. 8C, Animation S5) reveal that the  
444 vertical layers facilitate axial splitting. This macroscopic failure behavior arises from tensile  
445 failure along the layer interfaces. In addition, similar to the models with horizontal layers,  
446 inclined planes of nucleating fractures penetrate within layers later in deformation. Differences  
447 in particle velocities across layer interfaces indicate some slip across layer interfaces, but at  
448 lower magnitudes than observed in models with layers dipping at  $60^\circ$  (Fig. 7B). Gradients in the  
449 velocity fields within individual layers highlight that slip and opening along the interfaces and  
450 breakage in the top portion of the block did not accommodate all of the deformation within the  
451 rock. At higher confining stress (10 MPa), the spatial distributions of particle velocities (Fig. 7F,  
452 Animation S6) and fractures (Fig. 8F, Animation S6) indicate that the vertical layers do not  
453 appear to concentrate deformation along their interfaces as the rock fails, unlike the zero  
454 confining stress case. Instead, deformation gradually localizes onto an oblique fracture oriented  
455 at approximately  $30^\circ$  to  $\sigma_1$  that accommodates both shear and tensile failure. The impact of the  
456 vertical weak interfaces, similarly to horizontal layers (Fig. 7D, Fig. 8D, Animation S2), appears  
457 to be suppressed by confining stress, perhaps because the axial splitting mechanism (Fig. 7C,  
458 Animation S5) can no longer operate as effectively under the applied confining stress.

459 In homogeneous models that lack preexisting layers, the spatial distributions of particle  
460 velocities and fractures (Animations S7-S8) appear similar to those observed in models with  
461 horizontal layers, consistent with the similar failure stresses and internal friction of those sets of

462 models. In particular, under no confining stress, the rock begins to fail through the development  
463 of a broad zone of fractures at a top corner of the model that spreads into the block along a plane  
464 inclined at around  $30^\circ$  to  $\sigma_1$ .

#### 465 **4.4. Preferential strain localization along layer interfaces**

466 To quantify the degree and rate of strain localization onto preexisting weaknesses relative to  
467 the host rock, we track the number of (weak) interface bonds that break in each model time step  
468 versus (strong) host rock bonds (Fig. S9, Fig. 9). We calculate the percentage of stronger host  
469 bonds (out of the total strong bonds),  $B_s$ , and the percentage of weak interface bonds (out of the  
470 total weak bonds),  $B_w$ , that break (Fig. S9). We report the difference  $B_w - B_s$ , as parameter  $\Delta B$ .  
471 This parameter reveals the extent to which localized fracture development occurs along the  
472 preexisting weaknesses as opposed to within the host rock. A large value of  $\Delta B$  indicates damage  
473 is preferentially localized along the weak interfaces whereas a smaller value indicates a reduced  
474 impact of the weak interfaces. The evolution of  $\Delta B$  is presented as a function of the applied  
475 strain (normalized by failure strain) for the full range of tested confining stresses and interface  
476 orientations (Fig. 9). Trends are similar in block and cube models, as well as for rougher and  
477 smoother layer interfaces (Fig. S9), so we focus on the block models with smoother layer  
478 interfaces (Fig. 9).

479 Preceding failure in each model,  $\Delta B$  is positive because the percentage of weak bonds that  
480 break are always higher than the percentage of strong bonds (Fig. 9, Fig. S9). In each model,  
481 there is an initial increase in  $\Delta B$  with applied strain, but in some cases  $\Delta B$  decreases as the rock  
482 approaches failure. The layer orientation exerts a stronger influence on the evolution of  $\Delta B$  than  
483 the  $\sigma_2$  (Fig. 9). At each  $\sigma_2$ , the  $\Delta B$  evolution is relatively similar for constant  $\theta$  (Fig. 9A-C). At  
484 differing  $\theta$ , variations in  $\sigma_2$  do not produce as significant changes in the overall  $\Delta B$  evolution,

485 except at higher  $\theta$  (Fig. 9D-F). At higher  $\theta$ , the differences are systematic, and produced by the  
486 suppression of fractures opening in the direction of the applied confining stress. In particular, the  
487 overall slope of the  $\Delta B$  curve decreases as confining stress increases when the layers are vertical.  
488 The impact of  $\sigma_2$  on the  $\Delta B$  evolution increases with increasing  $\theta$  because the applied confining  
489 stress prevents some opening along layer interfaces in models with vertical layers, and does not  
490 prevent this opening in models with more shallowly dipping layers.

491 The  $\Delta B$  evolution reflects the impact of the microstructural reorganization and damage  
492 observed in the spatial distribution of particle velocities (Fig. 7) and fractures (Fig. 8). At lower  $\theta$   
493 ( $0-15^\circ$ ), the  $\Delta B$  increases, then flattens, and decreases as the rock approaches failure (Fig. 9A-  
494 D). This decrease indicates that an increasing percentage of strong bonds relative to the  
495 percentage of weak bonds are breaking in each time step. The spatial distribution of particle  
496 velocities and fractures in the model with horizontal layers also indicate that a decreasing  
497 number of bonds break along layer interfaces throughout the experiment (Fig. 7, Fig. 8).

498 When  $\theta$  is  $60^\circ$ , and  $\sigma_F$  and  $\mu_0$  are minimized,  $\Delta B$  and the rate of  $\Delta B$  continually increase  
499 preceding macroscopic failure for each  $\sigma_2$ . The  $\Delta B$  evolution (Fig. 9), and spatial distribution of  
500 particle velocities (Fig. 7) and nucleating fractures (Fig. 8) demonstrate that slip along the layer  
501 interfaces preferentially accommodates the majority of deformation throughout the models with  
502  $\theta=60^\circ$ . Gradients in the particle velocity fields within individual layers and the presence of  
503 fractures nucleating away from the weak interfaces demonstrate that damage in the host rock  
504 accommodates a portion of the total strain, and the  $\Delta B$  evolution quantifies the degree of strain  
505 localization onto the preexisting weaknesses.

506 To further assess the relative influence of layer orientation and confining stress on strain  
507 localization, we calculate the anisotropy ratio  $K_2$  (Fig. 10). Following the approach of Lisjak et



508 al. (2014),  $K_2$  is the ratio of the maximum to minimum differential stress at failure of  
509 experiments with equal confining stress and differing layer orientation:

$$510 \quad K_2 = \frac{(\sigma_1 - \sigma_2)_{max}}{(\sigma_1 - \sigma_2)_{min}} \quad \text{Eq. 3}$$

511 High  $K_2$  indicates larger differences between the failure stresses of the weakest and strongest  
512 models. Consistent with Lisjak et al. (2014),  $K_2$  decreases as confining stress increases, and  
513 begins to plateau when  $\sigma_2 > 20$  MPa. Comparing the relationship between  $K_2$  and confining stress  
514 for models with smoother and rougher layer interfaces and block- and cube-shapes indicates that  
515 smoother layer interfaces and greater interface area produce higher anisotropic ratios. This result  
516 arises because smoother layers and more area available for slip magnify the impact of the  
517 preexisting weaknesses on strain localization and subsequent failure. In addition, our  
518 comparisons of  $K_2$  indicate that layer interface roughness more strongly controls the evolving  
519 anisotropy of macroscopic failure strength ( $K_2$ ) at differing confining stresses than the model  
520 shape, and hence interface area available for slip.

521

## 522 **5. Discussion**

### 523 **5.1. Influence of planar preexisting weaknesses on failure behavior**

524 Our results constrain the manner in which preexisting mechanical weaknesses in layered  
525 rocks influence microscopic deformation that leads to macroscopic failure. Constraining the  
526 impact of heterogeneities on internal friction is critical for the robust assessment of intact  
527 material failure, and in the definition of safety factors when estimating the strength of  
528 geomaterials. We show that lower confining stress, intermediately-dipping weaknesses with  
529 respect to  $\sigma_1$ , smoother layer interfaces, and higher preexisting interface area available for slip  
530 magnify the impact of microscopic weaknesses on the macroscopic geomechanical behavior

531 (Fig. 11). Higher confining stress, more steeply or shallowly dipping weaknesses relative to  $\sigma_1$ ,  
532 rougher interfaces and less layer interface area available for slip reduce this impact. The relative  
533 importance of each of these parameters on internal friction within the explored parameter space,  
534 from most to least important is 1) confining stress, 2) weakness orientation relative to  $\sigma_1$ , 3)  
535 interface roughness, and 4) interface area (Fig. 11, Fig. 6).

536 Previous analyses reported trends similar to those observed here between individual  
537 parameters and failure behavior, such as preexisting weakness orientation and uniaxial  
538 compressive strength (e.g., Lisjak et al., 2014). Here and in previous studies,  $\sigma_F$  is minimized  
539 when  $\theta$  is  $60^\circ$ , and maximized at  $90^\circ$  and  $0-15^\circ$  (e.g., Donath, 1961; Duveau et al., 1998; Cho et  
540 al., 2012). Similarly, experimental studies have found that the internal friction coefficient is  
541 minimized at  $60^\circ$  and maximized at  $0^\circ$  and  $90^\circ$  (e.g., Donath, 1961; Nova, 1980). Our numerical  
542 distribution of strength relative to anisotropy orientation agrees better with experimental results  
543 than previous numerical analyses of FEM/DEM-DFN models (Lisjak et al., 2014) and DEM  
544 models (Dinç and Scholtès, 2018) that find minima in failure strength when preexisting  
545 anisotropies are oriented  $45^\circ$  from  $\sigma_1$ .

546 The present numerical contribution extends our understanding of the relative impact and  
547 importance of each parameter on failure behavior as well as the interplay between these  
548 parameters. Furthermore, our study directly examines the micromechanical processes that  
549 produce the resulting macroscopic behavior, and so provides insights into microstructural  
550 sources that produce particular macroscopic geomechanical behavior.

551 Such insights are generally not yet available experimentally without advanced techniques  
552 such as digital volume correlation (DVC) analysis of in situ microtomograms. DVC analysis  
553 provides local strain tensors within elastically and inelastically deforming material. Recent DVC

554 analysis on experiments with laminated shale examines microscopic strain localization preceding  
555 macroscopic failure, and links the observed local strain evolution to macroscopic failure  
556 behavior (e.g., McBeck et al., 2018). These time series of local strain tensors demonstrate that  
557 the lamination bedding plane orientation of the shale controls the evolving spatial distribution of  
558 local normal strains prior to failure. Furthermore, associated numerical investigations indicate  
559 that the localization of normal strains in turn controls the localization of shear strains. These  
560 differences in the microscopic strain evolution produce differences in the macroscopic behavior:  
561 the shale core fails at a higher differential stress when its laminations are set perpendicular to  $\sigma_1$   
562 than when its laminations are subparallel to  $\sigma_1$ . In contrast, the uniaxial compressive strength of  
563 the present numerical models with layers set perpendicular to  $\sigma_1$  are slightly lower than the  
564 strength of models with layers parallel to  $\sigma_1$ . This difference may arise from the lack of  
565 truncation factor used to specify the tensile strength of the bonds. In the present models,  
566 extension of the Mohr-Coulomb criterion into the tensile regime using the bond internal friction  
567 and bond cohesion determine the bond tensile strength. The application of a truncation factor  
568 reduces the bond tensile strength from that predicted from the microparameter Mohr-Coulomb  
569 criterion into the tensile regime. The measured tensile strength of rocks is often lower than that  
570 predicted from the Coulomb criterion. Although microparameter values are not expected to equal  
571 macroscopic rock values, if a truncation threshold was employed, models with layers parallel to  
572  $\sigma_1$  may have lower failure strengths than models with layers perpendicular to  $\sigma_1$ .

573 Models with the smoothest layer interfaces and greatest interface area produce the largest  
574 ranges in  $\sigma_F$  and  $\mu_0$ . In these models, the simulated rock is geomechanically the weakest when  
575 the weaknesses are oriented at  $\theta=60^\circ$  ( $\sigma_F=40$  MPa at zero confining stress), and strongest when  
576 the layers are parallel or perpendicular to  $\sigma_1$  ( $\sigma_F=120$  MPa at zero confining stress). Similarly, the

577 rock has the lowest  $\mu_0$  for layers at  $\theta=60^\circ$  (0.55), and highest  $\mu_0$  for layers oriented near parallel  
578 and perpendicular to  $\sigma_1$  (0.64-0.68). Estimates of  $\mu_0$  from the homogeneous models that lack  
579 layers exceed estimates of  $\mu_0$  from the layered models except when  $\theta=70-90^\circ$ . Consequently, the  
580 impact of preexisting weaknesses on  $\mu_0$  and the resulting likelihood of failure is particularly  
581 important when  $\theta=0-60^\circ$ , and less important when layers are sub-parallel to  $\sigma_1$ . The difference  
582 between the  $\mu_0$  calculated for the lower (0-20 MPa) and higher (20-50 MPa)  $\sigma_2$  ranges is 0.15-  
583 0.2, suggesting that decreasing  $\sigma_2$  by 20 MPa can increase the effective  $\mu_0$  by up to 0.2. Varying  
584 the orientation of the weaknesses may change  $\sigma_F$  by 66%, and  $\mu_0$  by 20% respectively.

585 The spatial distributions of fractures and particle velocities reveal that at low confining stress  
586 (0 MPa), the preexisting weaknesses impact both strain localization and macroscopic failure for  
587 all of the tested orientations (Fig. 7, 8). However, at higher confining stress (10 MPa), strain  
588 preferentially localizes onto the layer interfaces only when the layers are dipping at intermediate  
589 angles ( $\theta=60^\circ$ ). When the layers are more shallowly or steeply dipping ( $\theta=0^\circ$  and  $90^\circ$ ) strain  
590 effectively ignores the weak layers (Fig. 7, 8). The exploitation of the weaker layer contacts with  
591 intermediately dipping angles throughout deformation, and throughout the range of tested  
592 confining stresses, produces the lower failure stress and lower internal friction of these simulated  
593 layered rocks. Similarly, layered rocks with preexisting weaknesses at higher and lower  
594 orientations, i.e. subparallel or subperpendicular to  $\sigma_1$ , have higher failure stresses and higher  
595 internal friction because the microscopic deformation does not exploit the preexisting  
596 weaknesses as much as rocks with more intermediately dipping layers. This lack of exploitation  
597 causes the strength of the bulk matrix, rather than the strength of the preexisting weaknesses, to  
598 control the macroscopic strength in these rocks.

599 Early in the experiment when  $\theta=60^\circ$ , slip is nearly equally distributed amongst the  
600 preexisting layer interfaces, but in subsequent stages, slip localizes onto only one or two layer  
601 interfaces. This evolution produces emergent layers that are thicker than the preexisting layers.  
602 This behavior suggests that when the layers are oriented favorably for slip ( $\theta=45^\circ-60^\circ$ ), the  
603 initial width of layers may influence the onset of failure, but following the initial stage, the layer  
604 width does not significantly impact failure behavior and the macroscopic geomechanical  
605 properties.

606 Post-failure scanning electron microscope images of Tournemire shale provide evidence of  
607 similar interactions between preexisting weaknesses and microfractures (Bonnelye et al., 2017a).  
608 In these experiments, fractures tend to develop parallel to bedding planes when the orientation of  
609 preexisting weakness are intermediate to  $\sigma_1$ . When this orientation is parallel or perpendicular to  
610  $\sigma_1$ , fractures typically cross cut bedding planes. This varying degree to which fractures exploit  
611 preexisting weaknesses also arises in our numerical models. These experimental results provide  
612 important validation of the microstructural deformation observed in our numerical work.  
613 Furthermore, our numerical models and experimental work (Bonnelye et al., 2017a; Holt et al.,  
614 2015) demonstrate that both confining stress and layer orientation impact the degree to which  
615 fractures exploit weaknesses.

616 In this numerical work, we quantify the relative impact of confining stress and layer  
617 orientation on failure behavior using  $\Delta B$  (Fig. 9) and  $K_2$  (Fig. 10). In addition, our models  
618 highlight the evolution of the degree of exploitation of preexisting weaknesses preceding failure,  
619 and not only as post-failure snapshots retrieved from experiments (e.g., Bonnelye et al., 2017a),  
620 or inferred from elastic wave measurements (e.g., Bonnelye et al., 2017b). In particular, our  
621 results enable quantitative tracking of the rate and degree of strain localization onto preexisting

622 weaknesses relative to the host rock,  $\Delta B$ , throughout loading preceding failure (Fig. 9). This  
623 quantification demonstrates that the orientation of preexisting weaknesses more strongly controls  
624 the degree and rate of strain localization than the imposed confining stress (Fig. 9). Furthermore,  
625 the degree and rate of strain localization continually increase in models with the lowest failure  
626 strengths (layers oriented  $30^\circ$  from  $\sigma_1$ ), but plateau in models with higher failure strengths (layers  
627 oriented  $90^\circ$  from  $\sigma_1$ ). However, in models with higher failure strengths and layers oriented  
628 parallel to  $\sigma_1$ , such a plateau in  $\Delta B$  only occurs under higher confining stresses ( $>40$  MPa), and  
629 an acceleration in  $\Delta B$  occurs under lower confining stress. Consequently, the varying evolutions  
630 of  $\Delta B$  demonstrate how the evolving spatial distribution of microfractures and their localization  
631 onto preexisting weakness planes control macroscopic failure behavior. Tracking the anisotropic  
632 ratio  $K_2$  demonstrates that the roughness of layer interfaces exert greater control on differing  
633 failure behavior than the total layer interface area available for slip (Fig. 10).

## 634 **5.2. Micromechanical models of anisotropic rock failure**

635 Previous experimental studies have evaluated the impact of preexisting weaknesses on  
636 geomechanical behavior using laboratory data. For example, Duveau et al. (1998) compare the  
637 predictions of nine failure criteria to data from laboratory triaxial compression experiments on  
638 Angers schist. They conclude that discontinuous weakness planes models are particularly apt to  
639 capture the failure of anisotropic material because they are based on the two dominant failure  
640 mechanisms within anisotropic rock: failure along planes of weakness and failure elsewhere  
641 within the host rock. Of the discontinuous weakness planes models, our approach to evaluating  
642 the impact of weaknesses on failure is most similar to Jaeger's single plane of weakness theory  
643 (Jaeger, 1960). This formulation uses two failure envelopes following the Mohr-Coulomb failure  
644 criterion constructed from two sets of mechanical properties that represent failure along a plane

645 of weakness or failure within the host rock. The ranges in macroscopic geomechanical properties  
646 produced by deformation of our simulated layered rock enable construction of these envelopes  
647 with end-members identified in the simulations. Using the values from block models with  
648 smoother layer interfaces when  $\theta=60^\circ$  ( $\sigma_F=40$  MPa under no confining stress,  $\mu_0=0.55$ ) and  
649  $\theta=90^\circ$  ( $\sigma_F=120$  MPa under no confining stress,  $\mu_0=0.68$ ), at 7 km depth, a rotation of  $\sigma_1$  from  $0^\circ$   
650 to  $30^\circ$  from the layer orientation (or a  $30^\circ$  shift in the orientation of layering from  $\sigma_1$ ) is predicted  
651 to reduce the shear stress required for failure by 104 MPa. Typical coseismic stress drops range  
652 between 1-10 MPa (e.g., Smith and Sandwell, 2003), and stress changes of 0.1 MPa may be  
653 sufficient to trigger earthquakes (King et al., 1994), indicating that a decrease in 104 MPa is  
654 significant in the context of failure of preexisting faults in the crust. When considering the failure  
655 of intact sedimentary rock, a decrease in 104 MPa is significant because it approaches estimates  
656 of the uniaxial compressive strength of sedimentary rock. These results indicate that varying the  
657 orientation of weaknesses or  $\sigma_1$  can cause intact layered rock to behave as if it hosted a  
658 preexisting fault with no cohesion. Major earthquakes can rotate principal stress axes in tectonic  
659 settings (e.g., Hardebeck & Okada, 2018), and so may trigger this shift in the effective strength  
660 of the crust.

661 Recent analyses of series of microtomograms captured in situ throughout triaxial  
662 compression indicate that the failure of relatively isotropic and low-porosity rock (quartz-  
663 monzonite) behaves as a dynamical critical phase transition (Renard et al., 2018). Future  
664 analyses should target whether the failure of more mechanically anisotropic rock behaves  
665 critically, and/or is adequately predicted by other failure models, such as the sliding wing-crack  
666 model (Ashby & Sammis, 1990), the Drucker-Prager failure criterion (Drucker & Prager, 1952),  
667 a modified Mohr-Coulomb criterion that considers intermediate principal stresses and non-

668 linearity (Singh and Singh, 2011), or a discontinuous weakness planes model, such as Jaeger's  
669 criterion (Jaeger, 1960).

## 670 **6. Conclusions**

671 Constraining the impact of mechanical weaknesses on strain localization and macroscopic  
672 shear failure is critical for predicting the failure of buildings, tunnels, intact rocks, or preexisting  
673 faults. Our numerical triaxial compression experiments on layered sedimentary rock produce  
674 loading curves that broaden with increasing  $\sigma_2$ , stress drops that increase with increasing  $\sigma_2$ , and  
675 failure envelopes that decrease in slope at higher  $\sigma_2$ . The distributions of  $\sigma_F$  and  $\mu_0$  relative to the  
676 layer orientation share characteristics observed in laboratory experiments (e.g., Donath, 1961),  
677 with minimum  $\sigma_F$  and  $\mu_0$  near  $30^\circ$ , and maxima near  $0^\circ$  and  $90^\circ$  from  $\sigma_1$ . A  $30^\circ$  rotation in layer  
678 orientation (or  $\sigma_1$ ) produces a 66% and 20% difference in  $\sigma_F$  and  $\mu_0$ , respectively. Within the  
679 upper seismogenic zone (7 km) in a sedimentary basin, this difference in mechanical properties  
680 may decrease the shear stress required for Coulomb shear failure by 100 MPa. The degree of  
681 strain localization from along preexisting weaknesses, rather than the host rock, continually  
682 accelerates in rocks with the lowest failure strengths, but plateaus in rocks with higher failure  
683 strengths, indicating that the rate of microscopic strain localization controls macroscopic  
684 strength. Of the parameter space explored here, including layer orientation, layer interface  
685 roughness, and total layer interface area, varying the layer orientation produces the largest  
686 change in  $\mu_0$ , and varying total layer interface area produces the smallest change in  $\mu_0$ .

687

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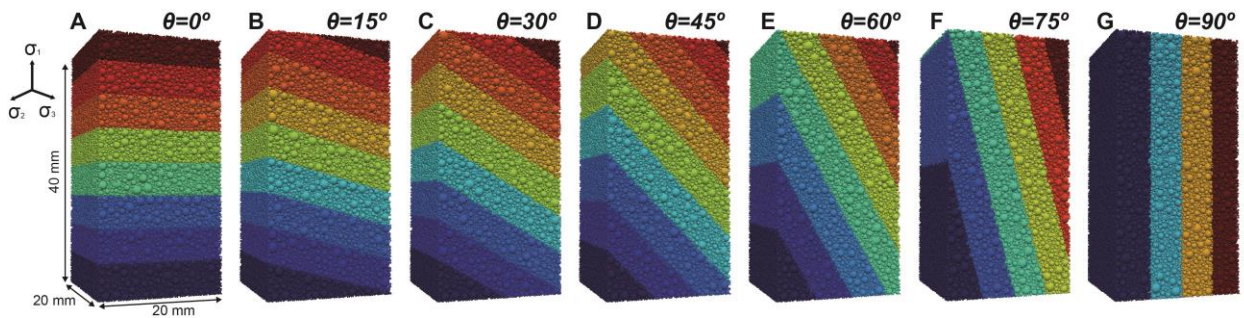
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- 843

844 **Figure 1**

845 Models of blocks with all tested layer orientations,  $\theta$ , defined as the orientation of the normal to  
846 the layer interface plane with respect to  $\sigma_1$ . Length and width of blocks are 20 mm, and height is  
847 40 mm. Layers are 5 mm thick.  $\sigma_1$  is vertical,  $\sigma_2$  and  $\sigma_3$  are horizontal, and  $\sigma_2=\sigma_3$ . Geometries  
848 shown here have 0.5 mm overlap between layers. Colors highlight the distinct layers and the  
849 orientation of preexisting weaknesses that separate each layer. All layers have identical bulk  
850 strength. See Fig. S1 for details of the particle packing technique.

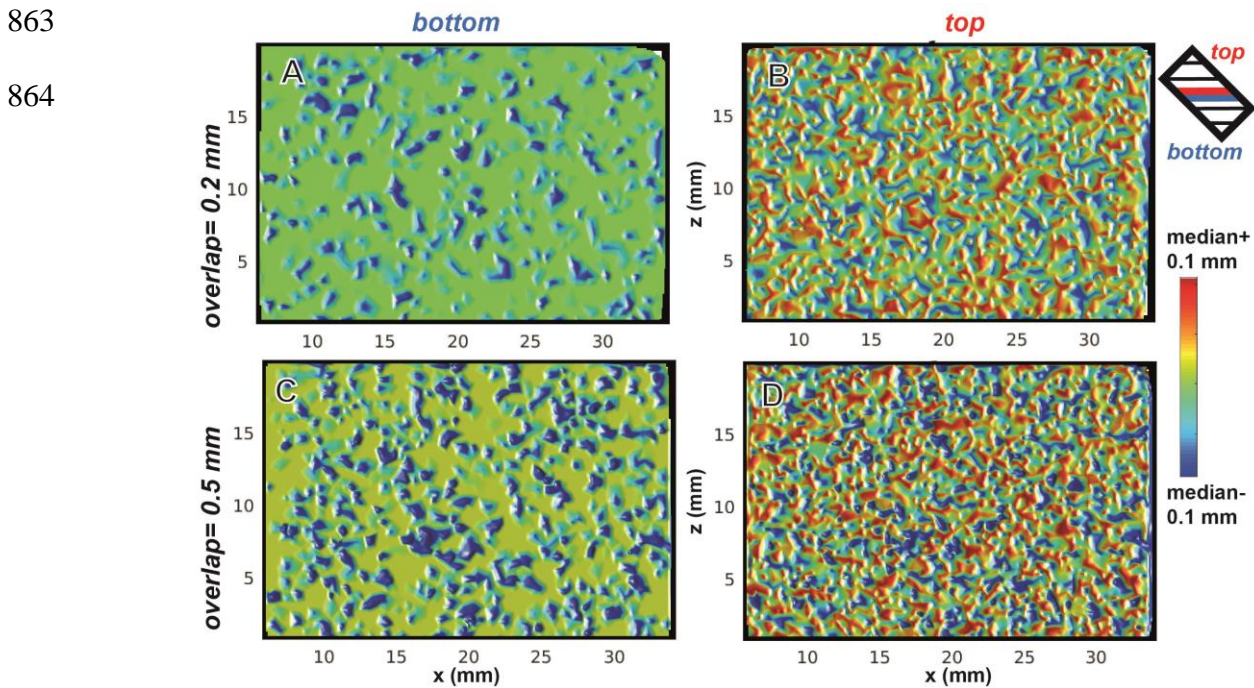


851

852

853 **Figure 2**

854 Surface topography of layer interfaces with 0.2 mm overlap (A-B), and 0.5 mm overlap (C-D) for  
855 block model with layers orientated 45°. A, C) Topography of bottom surface of layer interface. B,  
856 D) Topography of top surface of layer interface. We measure the topography as the distance  
857 between particle surfaces and a basal plane at the same orientation of the layers. The bottom  
858 surfaces are smoother, with lower root-mean-squared roughness,  $\chi_{RMS}$ , because we pack layers  
859 starting from the bottom layer and work upward. With smaller overlap (0.2 mm), the layer  
860 interfaces are smoother ( $\chi_{RMS}=0.028$  for the bottom surface) than with larger overlap (0.5 mm,  
861  $\chi_{RMS}=0.055$  for the bottom surface). Each topography coloring scheme ranges from the median of  
862 the topography field  $\pm 0.1$  mm.





865 **Figure 3**

866 Mechanical loading behavior for numerical triaxial compression simulations. Results from block

867 model with layers oriented at  $\theta=90^\circ$  and with rougher layer interfaces (0.5 mm overlap) are shown.

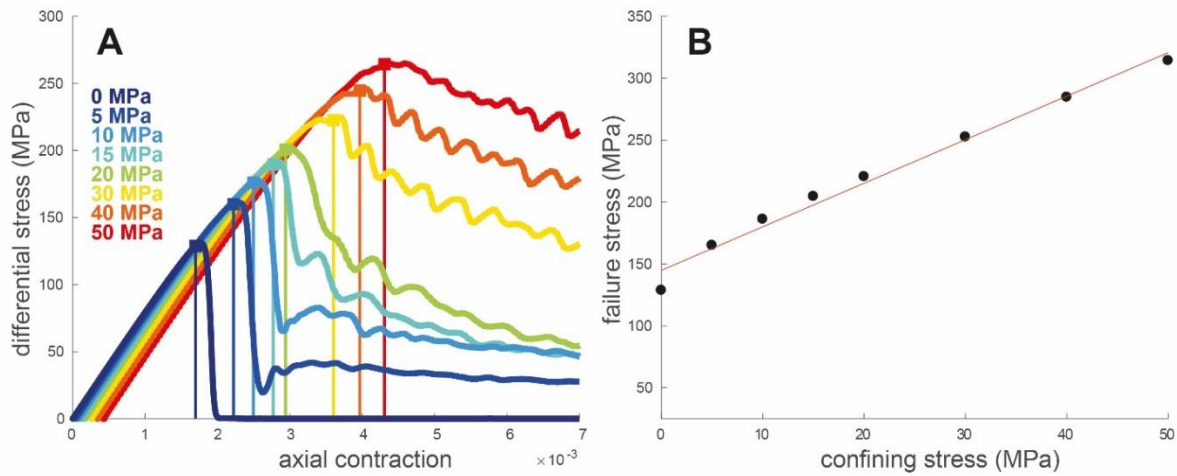
868 A) Axial contraction versus differential stress for confining stresses 0-50 MPa. Squares show

869 failure stress,  $\sigma_F$ , i.e., the peak stress preceding failure and the first stress drop, and vertical lines

870 show axial contraction at failure. B) Resulting relationship between applied confining stress,  $\sigma_2$ ,

871 and  $\sigma_F$  including the linear regression from which we estimate  $\mu_0$ . The slope of the failure envelope

872 of  $\sigma_2$  and  $\sigma_F$  decreases with increasing  $\sigma_2$ , and so is slightly non-linear.

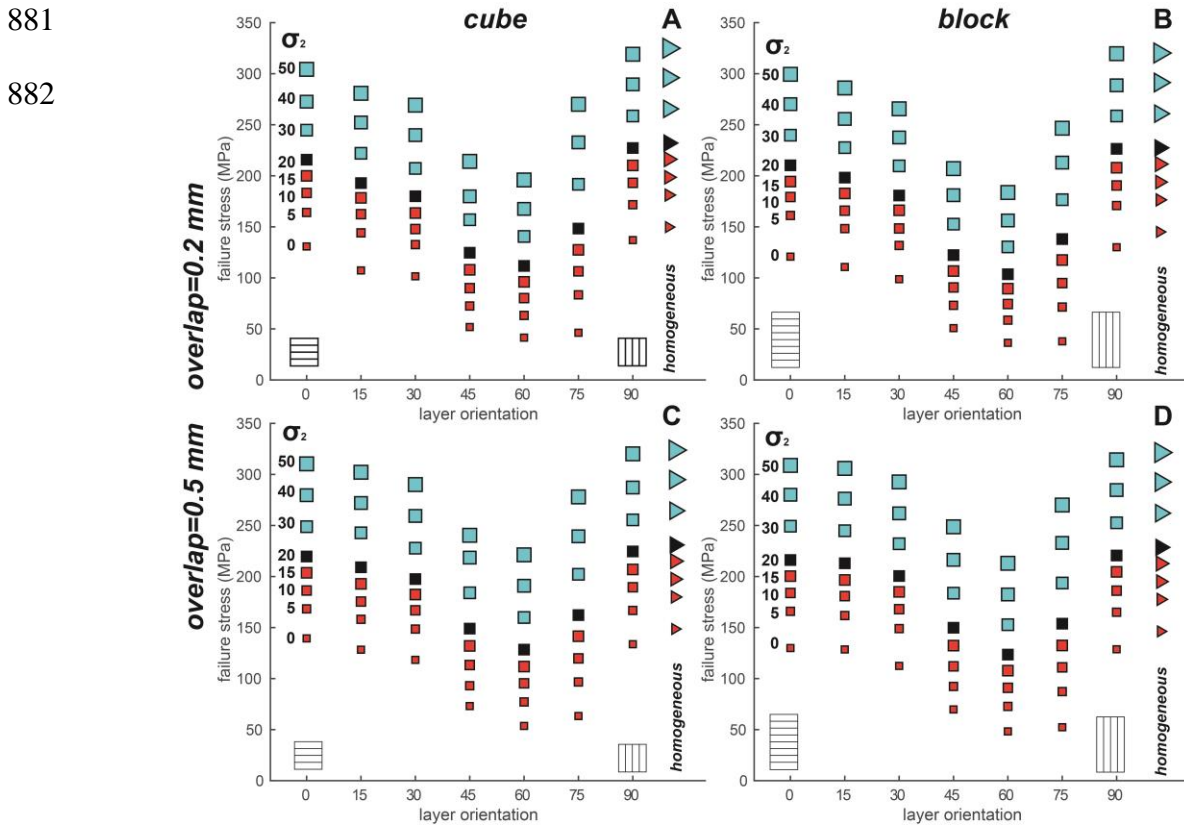


873

874

875 **Figure 4**

876 Distribution of  $\sigma_F$  as a function of  $\sigma_2$  and  $\theta$  for (A, B) smoother layer interfaces (0.2 mm overlap)  
 877 and (C, D) rougher layer interfaces (0.5 mm overlap), and (A, C) cube and (B, D) block geometries.  
 878 Results from lower (0-20 MPa), median (20 MPa), and higher (20-50 MPa)  $\sigma_2$  ranges are shown  
 879 in red, black, and blue, respectively. Triangles show results from homogeneous block model that  
 880 does not contain layers.

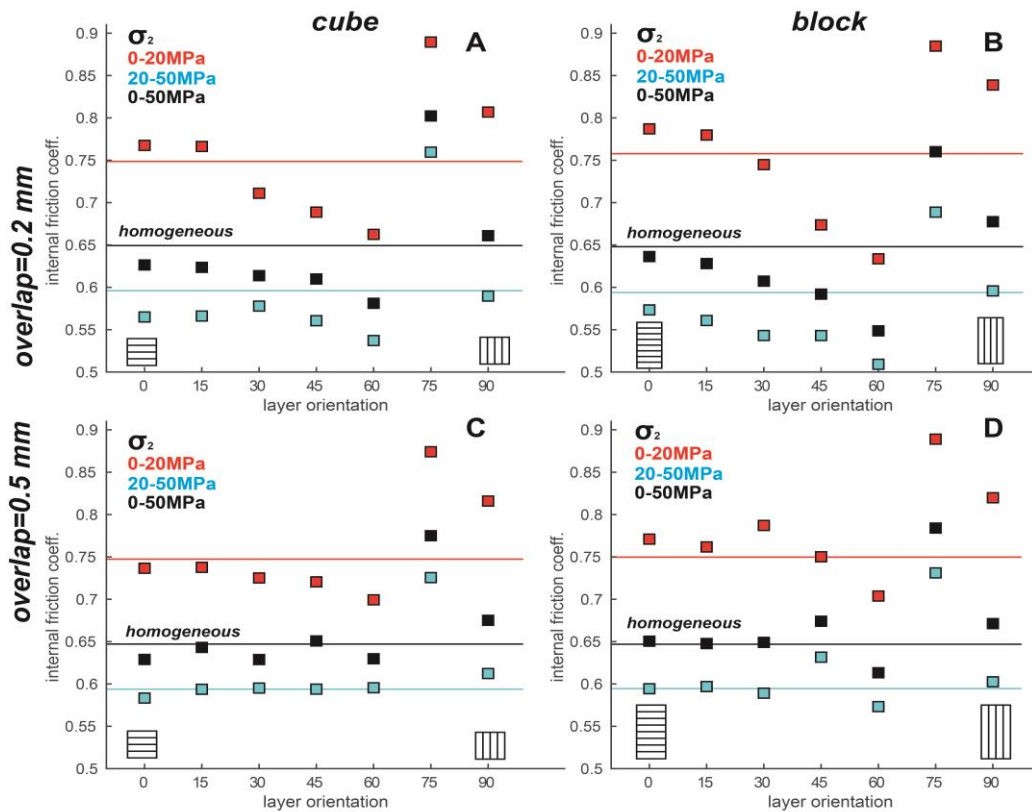


883 **Figure 5**

884 Distribution of  $\mu_0$  as a function of  $\sigma_2$  and  $\theta$ , for (A, B) smoother layer interfaces (0.2 mm overlap)  
 885 and (C, D) rougher layer interfaces (0.5 mm overlap), and (A, C) cube and (B, D) block geometries.  
 886  $\mu_0$  calculated from higher (20-50 MPa), lower (0-20 MPa), and full (0-50 MPa)  $\sigma_2$  range shown in  
 887 blue, red and black, respectively. Horizontal lines show results from homogeneous block model  
 888 that does not contain layers.

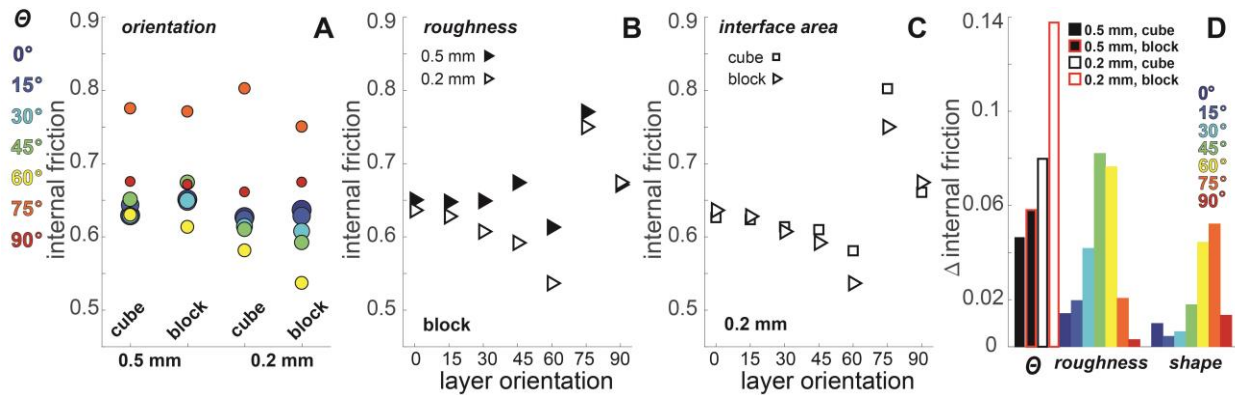
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891 **Figure 6**

892 Relative impact of parameters on failure: (A) interface orientation, (B) interface roughness, (C)  
 893 interface area (i.e., model shape). D) Difference in maximum and minimum  $\mu_0$  of each set of  
 894 models comparing area (C) and roughness (B), and the difference in  $\mu_0$  when  $\theta=90^\circ$  and the  
 895 minimum  $\mu_0$  (A). A) Color of symbol indicates layer orientation. B) Results from block models  
 896 with 0.5 mm overlap (black) and 0.2 mm overlap (white). C) Results from models with 0.2 mm  
 897 overlap with cube shapes (squares) and block shapes (triangles). D) Impact of parameters on the  
 898 difference in  $\mu_0$ . Varying  $\theta$  produces the largest  $\Delta\mu_0$ , even discounting when  $\theta=75^\circ$ . Varying the  
 899 layer interface area (model shape) produces the smallest  $\Delta\mu_0$ . Fig. S8 compares results from all of  
 900 the models.



901

902 **Figure 7**

903 Spatial distributions of particle velocities

904 highlight the influence of  $\theta$  and  $\sigma_2$  on strain

905 distribution along interfaces and within host.

906 Failure of simulated layered rock with  $\sigma_2=0$

907 MPa, and (A)  $\theta=0^\circ$ , (B)  $\theta=60^\circ$ , and (C)  $\theta=90^\circ$ ,

908 and with  $\sigma_2=10$  MPa and (E)  $\theta=0^\circ$ , (F)  $\theta=60^\circ$ ,

909 and (G)  $\theta=90^\circ$ . Black numbers are the

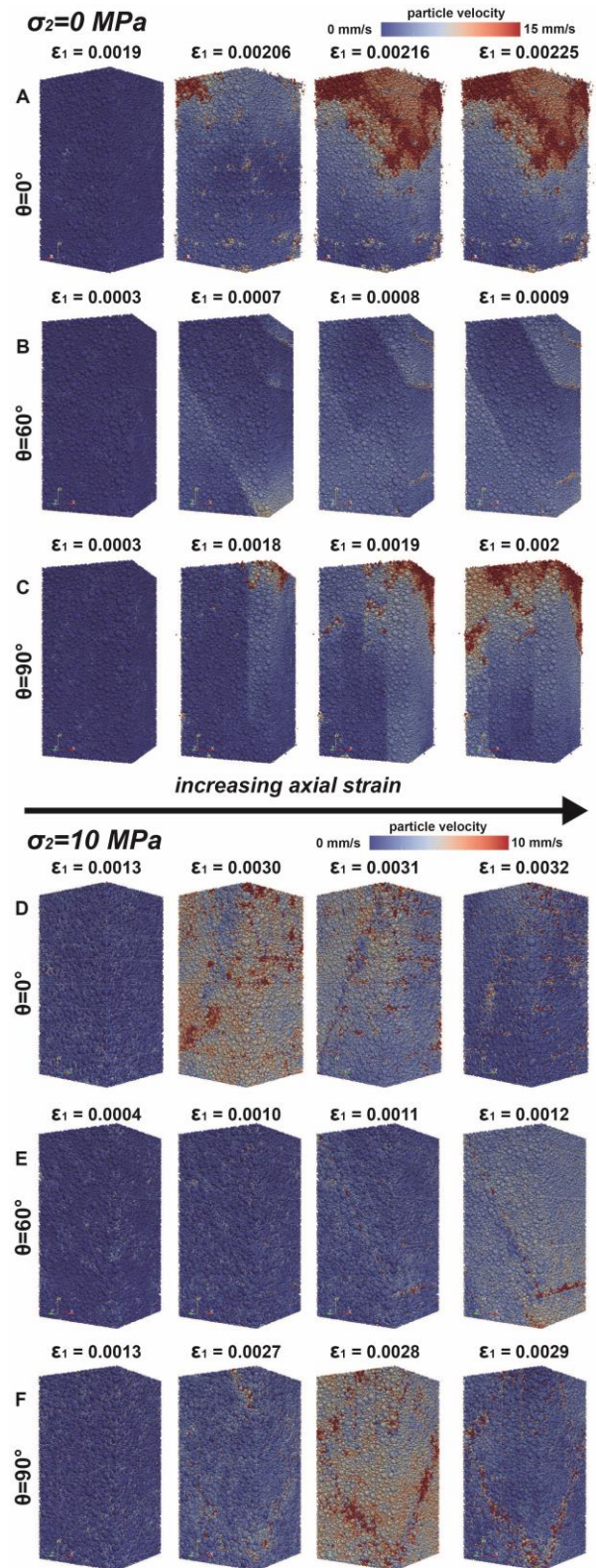
910 accumulated axial strain, which increase toward

911 the right. Colors show the total magnitude of the

912 velocity of particles. Block models with 0.2 mm

913 overlap are shown.

914

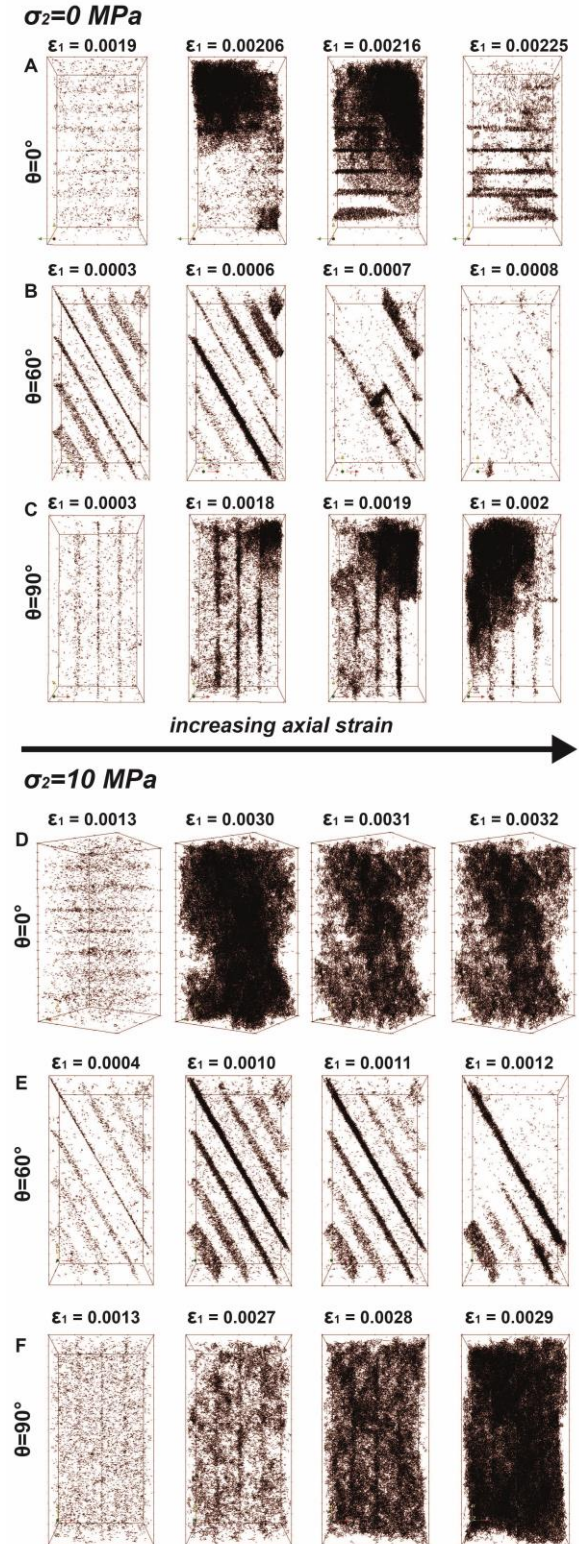




915 **Figure 8**

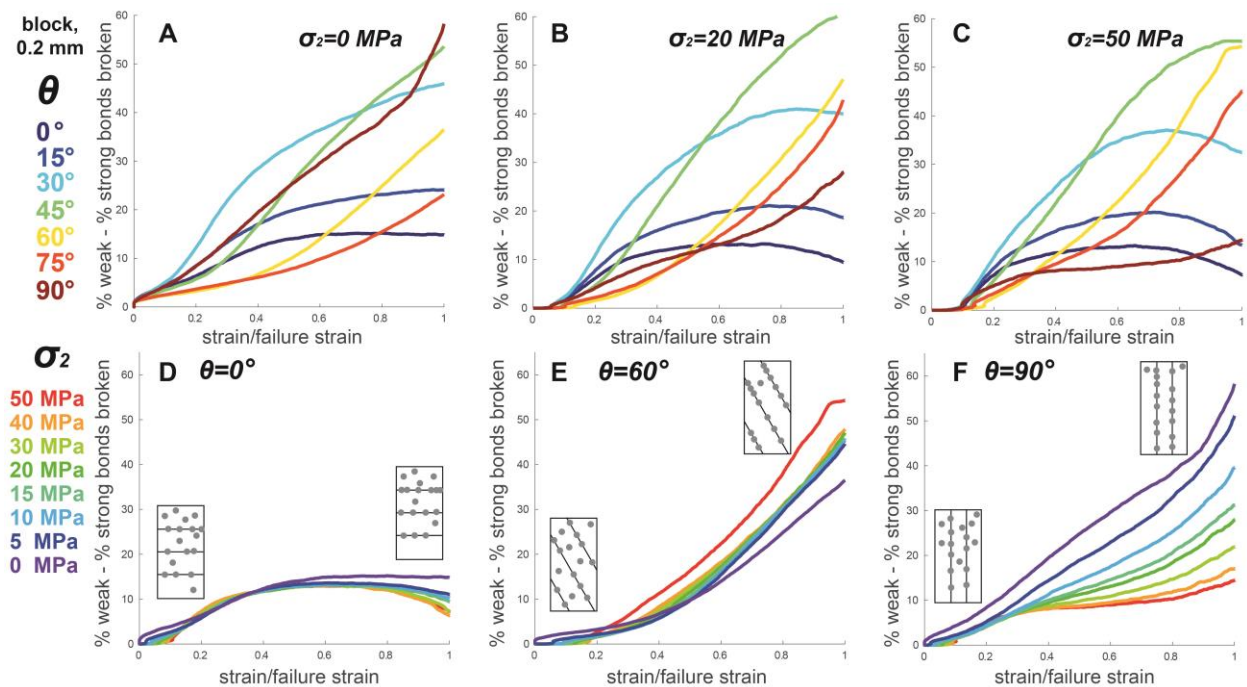
916 Spatial distributions of nucleating fractures  
917 highlight the influence of  $\theta$  and  $\sigma_2$ . Failure of  
918 simulated layered rock with  $\sigma_2=0$  MPa, and (A)  
919  $\theta=0^\circ$ , (B)  $\theta=60^\circ$ , and (C)  $\theta=90^\circ$ , and with  $\sigma_2=10$   
920 MPa and (D)  $\theta=0^\circ$ , (E)  $\theta=60^\circ$ , and (F)  $\theta=90^\circ$ .  
921 Black numbers are the accumulated axial strain.  
922 Black lines show location of bonds that break at  
923 each time interval, i.e., nucleating fractures. Block  
924 models with 0.2 mm overlap are shown.

925



926 **Figure 9**

927 Evolution of failure, characterized as  $\Delta B$ , indicates the relative impact of fracturing along weak  
928 interfaces compared to within the host rock. Failure localization,  $\Delta B$ , is shown as the difference  
929 between the percentage of weak bonds broken out of all the weak bonds, and the percentage of the  
930 strong bonds broken out of all the strong bonds for a representative range of  $\sigma_2$ : (A)  $\sigma_2=0$  MPa,  
931 (B)  $\sigma_2=20$  MPa, and (C)  $\sigma_2=50$  MPa with all tested layer orientations,  $\theta$ , and for a representative  
932 range of  $\theta$ : (D)  $\theta=0^\circ$ , (E)  $\theta=60^\circ$ , (F)  $\theta=90^\circ$ , and all tested  $\sigma_2$ . A-C) Color of lines correspond to  $\theta$ .  
933 D-F) Color of lines correspond to  $\sigma_2$ . Data are presented for smoother layer interfaces (0.2 mm  
934 overlap) of block models.

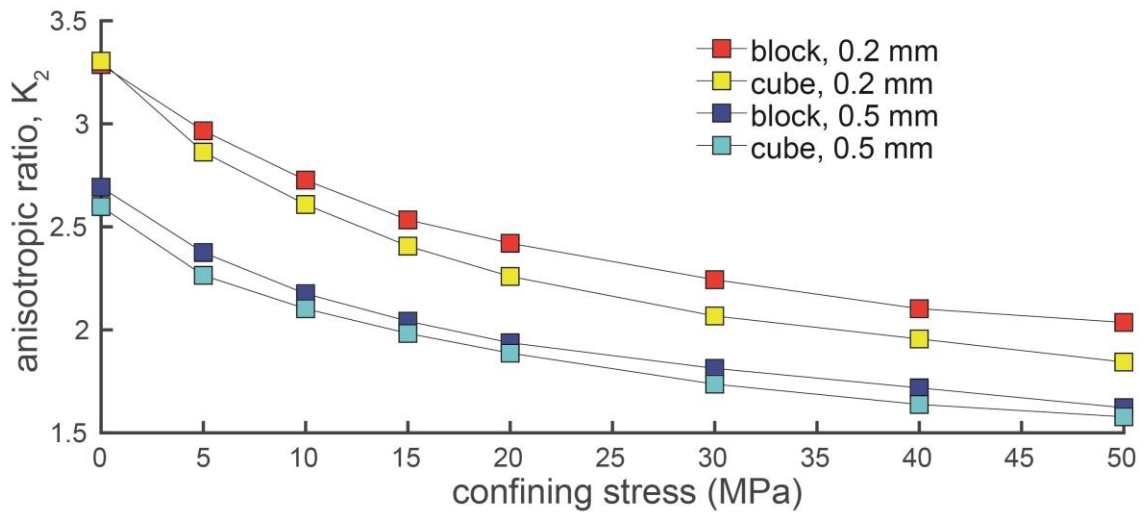


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936

937 **Figure 10**

938 Evolution of anisotropic ratio,  $K_2$ , for models with varying layer interface roughness and area  
939 available for slip. Following Lisjak et al. (2014),  $K_2$  is the ratio between the maximum and  
940 minimum differential stress at failure for experiments with different layer orientations, and  
941 constant confining stress (Eq. 3). Models with smoother layers (0.2 mm overlap, red and yellow  
942 squares) behave more anisotropically than models with rougher layers (0.5 mm overlap, light and  
943 dark blue squares). Models with block shapes (red and dark blue squares) behave more  
944 anisotropically than models with cube shapes (yellow and light blue squares), as expected from  
945 the larger difference in area available for slip in block models. Increasing confining stress  
946 suppresses anisotropic behavior.





947 **Figure 11**

948 Sketch summarizing the relative importance of preexisting weakness property on the macroscopic

949  $\mu_0$ . Preexisting weaknesses produce greater changes in  $\mu_0$  at lower confining stress, at intermediate

950 layer orientations relative to  $\sigma_1$ , with

951 smoother layer interfaces, and with

952 greater total layer interface area.

953 Varying the orientation produces the

954 largest changes in  $\mu_0$ , and varying the

955 interface area produces the smallest

956 changes in  $\mu_0$  over the range of

957 parameter space explored here.

