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1 Investigation of powder flowability at low stresses by 2 DEM modelling

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8 **ABSTRACT**

9 Ball indentation is a technique capable of assessing powder flowability down to very low consolidation
10 stresses (≤ 1 kPa). With this method, powder flowability is determined by measuring the hardness of a
11 powder bed, which allows the unconfined yield strength to be inferred via the constraint factor. The
12 latter is well established for continuum materials, whereas for particulate systems its dependency on
13 stress level and powder properties is not well defined. This work investigates these factors by simulating
14 the ball indentation method using DEM. The constraint factor is shown to be independent of pre-
15 consolidation stress. Constraint factor generally increases with interface energy for relatively
16 cohesionless powders, though not for cohesive powders. An increase in plastic yield stress leads to a
17 decrease in the constraint factor. Increasing the coefficient of interparticle static friction reduces the
18 constraint factor, while increasing the coefficient of inter-particle rolling friction significantly increases
19 the constraint factor.

20 **Keywords:**
21 Powder flowability
22 Low consolidation stresses
23 Ball indentation
24 Shear cell
25 DEM modelling

26

27 **1 Introduction**

28 The inability of cohesive powders to flow consistently and reliably constitutes one of the major
29 concerns of industries that deal with bulk solids handling, such as pharmaceuticals, food and fast-
30 moving consumer goods, since it can lead to process downtime and reduced manufacturing efficiency.
31 Therefore, the study of powder flowability is vital, albeit complex, since particulate systems' behaviour
32 is multivariable, depending on both intrinsic particle properties such as particle size, size distribution,
33 shape, density, surface roughness, porosity, cohesive and frictional forces between particles and
34 system properties such as the stresses applied during storage and processing, and strain rate, as well
35 as on external factors such as temperature and humidity (Rios, 2006).

36 Over the years, there have been a diverse array of techniques developed for assessing powder
37 flowability, which mostly focused on silo and hopper design and/or qualitative assessment of bulk
38 solid flow, yet there is still a limited understanding on precisely how particle properties, stressing
39 conditions and environmental factors affect flowability in a way that could lead to a reliable prediction
40 of powder flow behaviour. None of the flow evaluation methods are universally applicable, since they
41 usually measure a certain property of the powder that reflects the state of the powder in this specific
42 experiment, and therefore their usage is meaningful in limited applications. Nevertheless, shear cells
43 are the most widely accepted quantitative technique, with approaches developed for utilising the
44 measurements for silo and hopper design (Jenike, 1961; 1964). Shear cells operate in the quasi-static
45 regime, typically at moderate to high stresses that exist in large storage bins or hoppers, and measure
46 the shear stress required to initiate flow under a given normal stress, and subsequently allowing the

47 unconfined yield strength to be estimated from the measured yield locus. As with most traditional
48 flowability assessment techniques, they typically fail to evaluate the flow behaviour of cohesive
49 powders at low consolidation stresses (≤ 1 kPa). At such stresses shear cells are normally unable to
50 generate steady-state shear, or the reproducibility of the measurement of unconfined yield strength
51 is greatly reduced, or does not correlate with observed process behaviour (Schulze, 2008; Sørensen *et al.*,
52 2014). The common practice is to assume linearity for yield loci, which are extrapolated towards
53 zero normal stress, leading to an overestimation of unconfined yield strength and cohesion, since yield
54 loci tend to curve downwards in the region of low stresses (Schulze, 2008). There are many processes
55 of great interest during which granular materials are exposed to such low stresses and their flowability
56 needs to be determined, such as flow in small scale hoppers, filling and dosing of powders in capsules,
57 feeding powders for packing and tableting machines, and dispersion in dry powder inhalers (DPI).
58 Under such stresses, small contact areas exist between constituent particles, and very little particle
59 deformation occurs, leading to a low structural strength (Harnby *et al.*, 1987). An aerated powder
60 needs a lot less energy to make it flow than is required when the same powder is consolidated
61 (Freeman, 2005). For all the aforementioned reasons, there is a need for established methods for
62 powder flow measurement at low stresses, so that the results are generalisable to a broad class of
63 powders. One such technique for assessment of powder flow at low stresses is ball indentation, which
64 was introduced by Hassanpour and Ghadiri (2007), with its operational window being thoroughly
65 established experimentally by Zafar *et al.* (2017) and computationally by Pasha *et al.* (2013). The first
66 step of this method is to create a powder bed inside a cylindrical die (made of low friction material)
67 and consolidate it by uniaxial compression to a desired stress. Then the compressed bed is penetrated
68 by a spherical indenter, whilst its penetration depth and the resulting vertical force are measured until
69 a desired depth is reached, and then the indenter is unloaded (Hassanpour and Ghadiri, 2007), as
70 shown in Fig. 1.

71

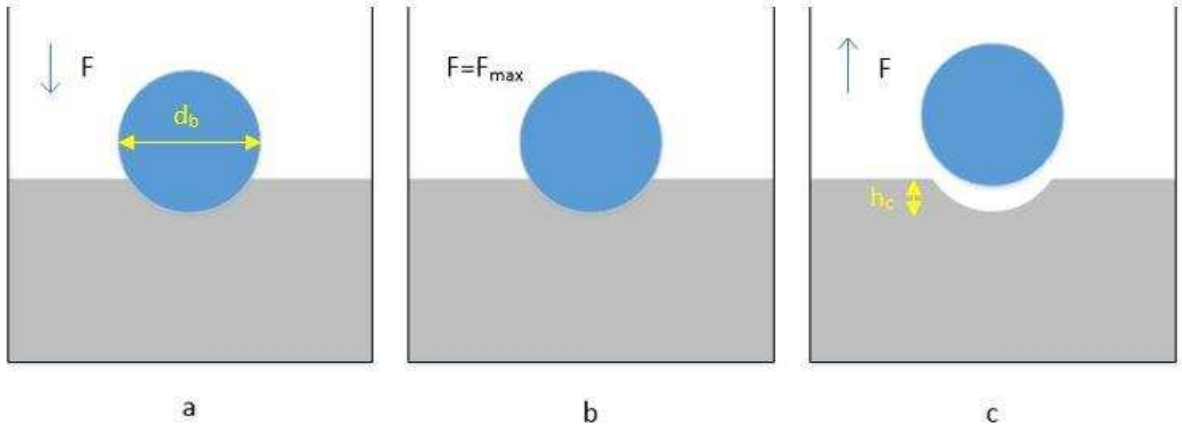


Fig. 1. Indentation step of the procedure.

From the force-displacement response of the powder bed, the hardness of the material is directly measured via Eq. (1), which corresponds to the resistance of the bed to plastic deformation.

$$H = \frac{F_{max}}{A} \quad (1)$$

where F_{max} is the maximum indentation load and A is the projected area of the impression of the indenter, calculated from Eq. (2):

$$A = \pi(d_b h_c - h_c^2) \quad (2)$$

where d_b is the indenter diameter and h_c is the indent depth after unloading. If unloading has negligible effect on the material's recovery, the penetration depth at maximum indentation load can be used in place of h_c (Hassanpour and Ghadiri, 2007).

Ball indentation offers the capability of obtaining hardness measurements at any stress level, as long as a flat surface is available for indentation. However, it is commonly of interest to measure the unconfined yield strength, as determined by shear cells. Tabor (1951) demonstrated for continuum materials that for a given material, hardness is directly linked to the yield strength via the constraint factor, C , as shown in Eq. (3).

$$H = C \sigma_c \quad (3)$$

90 where σ_c is the unconfined yield strength. The constraint factor represents the phenomenon of plastic
91 constraint seen in penetration tests of continuum solids. The penetration of continuum materials
92 leads to the formation of a local plastic zone around the indenter, where the volume of material under
93 yielding condition is surrounded by an elastically deformed region, which cannot easily flow. This leads
94 to an increase in the local yield strength, represented by the hardness (Kozlov *et al.*, 1995). This
95 phenomenon has been found to be existent in particulate systems as well (Hassanpour and Ghadiri,
96 2007; Zafar, 2013). In the case of continuum solids, the constraint factor has been stated to have a
97 value of 3 for rigid-perfectly plastic materials (Hill, 1950), while according to Tabor (1951) this value is
98 applicable only for ductile metals. Furthermore, for continuum materials C is known to depend on
99 material properties (Tabor, 1996). Johnson (1985) introduced a relationship between indentation
100 hardness and yield strength for elastic-perfectly plastic materials, based on Young's modulus, radius
101 of the impression and the indenter radius. For particle systems the constraint factor doesn't have a
102 fixed value, with different values determined for a variety of powders (Hassanpour and Ghadiri, 2007;
103 Wang *et al.*, 2008; Zafar 2013). Currently the constraint factor of a powder is not known *a priori*, nor
104 is its behaviour throughout a wide stress range, since shear cells cannot be operated at low
105 consolidation stresses. In addition to this, it is unknown which particle properties influence C , and to
106 what extent. Shedding light on all of the above is of particular importance, because it will render it
107 possible for Eq. (3) to be utilised to infer unconfined yield strength from ball indentation
108 measurements, which are applicable at low stresses that cannot usually be reached by shear cells
109 (Zafar, 2013).

110 The Distinct Element Method (DEM) constitutes the most well-established and widely used
111 computational technique capable of describing the mechanical behaviour of particles, since it takes
112 into account the physical and mechanical properties of each individual particle within a system. This
113 can provide fundamental understanding of powder behaviour, with a characteristic example being
114 determination of the internal stresses exerted in a powder bed, which typically cannot be determined
115 experimentally. DEM was first introduced by Cundall (1971) and further developed by Cundall and

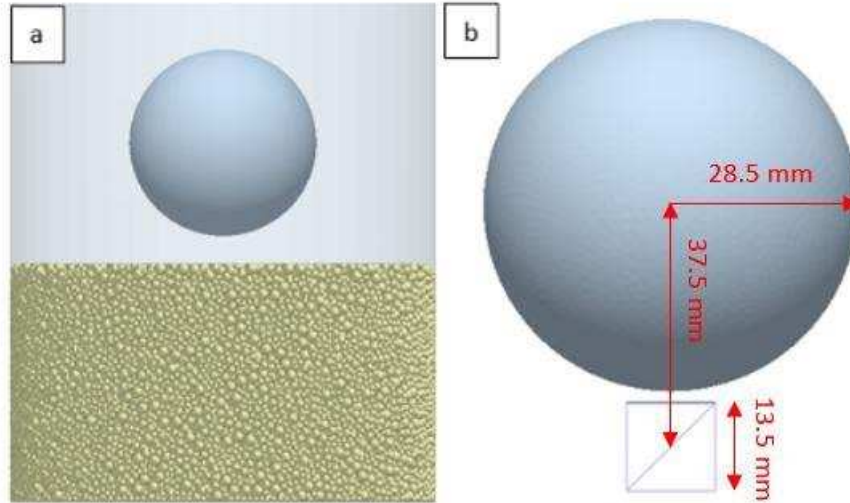
116 Strack (1979). In recent years, the continuous improvement of computer performance and
117 development of rigorous models more accurately representing the true contact mechanics between
118 particles have resulted in a substantial increase in DEM use as a research tool. This has been applied
119 in the field of powder flow, with Hare and Ghadiri (2013), Pasha *et al.* (2013) and Höhner *et al.* (2014)
120 being examples of researchers that have employed DEM simulations on powder flow studies.

121 In this work, the ball indentation method is simulated using DEM to determine the constraint factor
122 throughout a wide range of low and high pre-consolidation stresses, since the consistency of
123 constraint factor towards low stresses has not been demonstrated elsewhere. Furthermore, the
124 effects of individual particle properties, which cannot be easily modified experimentally, on the
125 constraint factor and the flow resistance are investigated, which until now has not been reported
126 using DEM.

127 **2 DEM simulation setup**

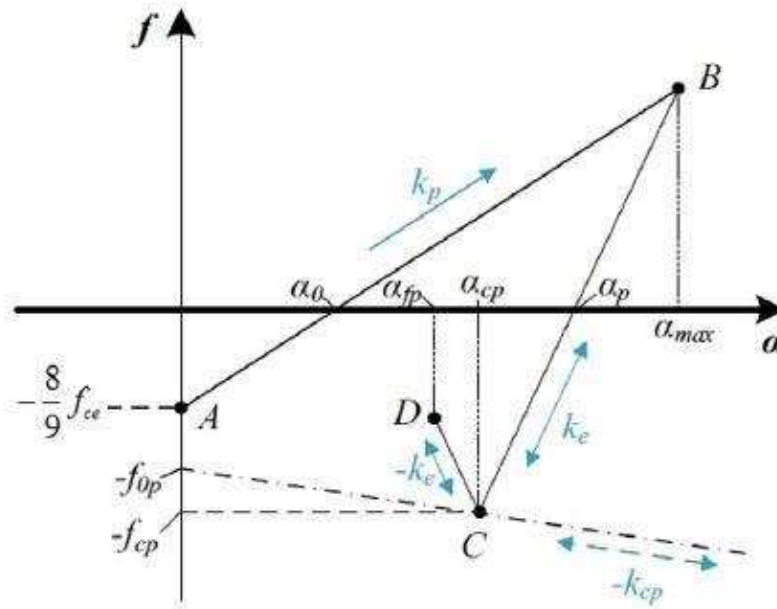
128 EDEM® DEM software provided by DEM Solutions (Edinburgh, UK) is used to simulate the ball
129 indentation system, which is shown in Fig. 2a. The linear elasto-plastic and adhesive contact model of
130 Pasha *et al.* (2014), shown in Fig. 3, is used to represent cohesive powders. This model is a simplified
131 version of the model by Thornton and Ning (1998), which is less computationally expensive. Also, it
132 considers aspects of Tomas (2007), Luding (2008) and Walton and Johnson (2009) models.

133



134

135 Fig. 2. Ball indentation in EDEM® (a: simulated ball indentation system, b: stress measurement cell).



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139 **Fig. 3. The Pasha *et al.* (2015) contact model**

139 In this model, once the contact is established at an overlap, α , equal to zero (point A), the contact

140 force immediately reduces to a negative force, representing van der Waals forces, with magnitude

141 equal to 8/9 times the JKR elastic pull-off force, f_{ce} , given by Eq. (4) (Johnson *et al.*, 1971):

142
$$f_{ce} = \frac{3}{2} \pi R^* \Gamma \quad (4)$$

143 where Γ is the interface energy and R^* is the reduced radius computed from Eq. (5):

144
$$R^* = \left(\frac{1}{R_1} + \frac{1}{R_2} \right)^{-1} \quad (5)$$

145 where R_1 and R_2 are the radii of the two elements in contact. In case one of the elements in contact
 146 is a wall and not a particle, its radius is considered to be infinite (∞).

147 Initial elastic deformation is ignored and the deformation of the contact is plastic during loading up
 148 to the maximum loading force reached at point B, with the contact force, F_n , given by Eq. (6):

149
$$F_n = k_p a - \frac{8}{9} f_{ce} \quad (6)$$

150 where k_p is the plastic stiffness.

151 After a_{max} (point B) is reached, unloading proceeds with elastic stiffness (k_e), reaching first an overlap,
 152 a_p , at which point the unloading force becomes zero, with the contact force in this part of the graph
 153 given by Eq. (7):

154
$$F_n = k_e (a - a_p) \quad (7)$$

155 If reloading occurs, the contact force follows Eq. (7) until point B is reached, beyond which the contact
 156 deforms plastically with stiffness k_p . Otherwise, unloading continues until the maximum tensile force,
 157 known as the pull-off force, f_{cp} , is reached at an overlap of a_{cp} (point C). Unloading beyond this point
 158 is governed by a 'stiffness' equal to $-k_e$ until the contact breaks at an overlap of α_{fp} (point D), with the
 159 force being 5/9 times the pull-off force, f_{cp} . On the CD line the contact force is calculated from Eq. (8):

160
$$F_n = -k_e (a - 2a_{cp} + a_p) \quad (8)$$

161 The plastic deformation described by this model is reversible. If the two particles come towards each
 162 other again after the contact has been broken, the contact is re-established at an overlap slightly larger
 163 than α_{cp} , because the particles relax after contact breakage, with the contact force being 8/9 times
 164 the pull-off force, f_{cp} . The pull-off force, f_{cp} , and the overlap at contact breakage, α_{fp} , are determined
 165 based on the interface energy, Γ , the reduced radius (R^*), the elastic stiffness (k_e) and the maximum

166 contact force, f_{max} , which is achieved at the maximum overlap, a_{max} (point B). As the degree of plastic
 167 deformation, α_{cp} , increases, so does the pull-off force. For computational cost-efficiency purposes, the
 168 linearised version of the contact model's pull-off force curve is used in this work, where the pull-off
 169 force is given by Eq. (9):

$$170 \quad f_{cp} = -k_{cp}a_{cp} + f_{0p} \quad (9)$$

171 where k_{cp} is the slope of the linear fit to the pull-off force curve and f_{0p} is the intercept of the fit with
 172 the force axis (see Pasha *et al.* (2014) for further detail).

173 For tangential displacement, the tangential stiffness, F_t , is taken to be linear, and is given by Eq. (10):

$$174 \quad F_t = k_t a_t \quad (10)$$

175 where k_t is the tangential stiffness at the contact and a_t is the tangential overlap.

176 The criteria for sample, die and indenter dimensions established by Pasha (2013) and Zafar (2013) are
 177 adhered to in this work. The indenter velocity is set to 0.057 m/s during loading and unloading, which
 178 results in a strain rate of 2 s^{-1} , assuming strain rate is equal to indenter velocity divided by indenter
 179 radius. This corresponds to a dimensionless strain rate of around 0.03 according to Eq. (11) introduced
 180 by Tardos *et al.* (2003), therefore testing in the slow, frictional regime.

$$181 \quad \gamma^{o*} = \gamma^o \sqrt{\frac{d_p}{g}} \quad (11)$$

182 where γ^{o*} is the dimensionless shear strain rate, γ^o is the shear strain rate, d_p is the particle diameter
 183 and g is the gravitational acceleration.

184 Around 68 000 spherical particles of 33.3 % w/w 1 mm, 33.3 % w/w 1.43 mm and 33.3 % w/w 1.86
 185 mm radius were generated inside a cylindrical die of 65 mm radius and 500 mm height, with an initial
 186 downward velocity of 0.5 m/s, and allowed to settle under gravity, so that a powder bed height of
 187 approximately 72 mm is obtained. The particles created were given a size distribution in order to avoid

188 ordered packing. Once the particles had settled, which is indicated by their average velocity having
 189 reached a negligible value (≈ 0.001 m/s), a cylindrical piston of 65 mm radius was generated above the
 190 powder bed, and driven downwards at a velocity of 0.057 m/s until contact was made, at which point
 191 a servo-control mechanism modified the piston velocity until the target vertical stress was achieved.
 192 The target stress was maintained for a short period (0.2 - 0.3 s), before unloading the piston at the
 193 same velocity until the vertical stress reached zero, and finally removing it from the simulation.
 194 Following this consolidation step, a 28.5 mm radius spherical indenter was generated above the
 195 consolidated powder bed, and driven downwards at the same velocity as the piston until a penetration
 196 depth of approximately 26 mm was obtained.

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All the particles simulated were given properties similar to nylon, having a particle density of 1,000
 kg/m³, a Young's modulus of 2 GPa and a Poisson's ratio of 0.25. The properties of both particle-
 particle and particle-wall interactions that were used for all simulations are shown in Table 1, with the
 particle-particle and particle-wall values reported referring to the values given for the interactions
 between two mid-sized particles, and a mid-sized particle and the geometries, respectively.

Table 1. Properties used in DEM simulations (default values indicated in bold).

Symbol	Property	Particle-Particle	Particle-Wall
k_e (kN/m)	Elastic stiffness	165	165

k_p (kN/m)	Plastic stiffness	100	100
k_t (kN/m)	Tangential stiffness	165	165
k_{cp} (kN/m)	Slope of the linear fit to the pull-off force of Pasha <i>et al.</i> curve	1.43	0
f_0 (N)	Contact force at zero overlap	-0.117	0
f_{0p} (N)	Intercept of the linear fit to the pull-off force with the force axis	-0.0148	0
e (-)	Coefficient of restitution	0.3	0.3
μ_s (-)	Coefficient of static friction	0.1, 0.3 , 0.5	0.1
μ_r (-)	Coefficient of rolling friction	0.01 , 0.05, 0.1	0.01
Γ (J/m ²)	Interface energy	1, 2, 5 , 10, 20	0
σ_y (MPa)	Plastic yield stress	11.25, 22.5, 45	-

214

215 The default values for the coefficients of restitution, static friction and rolling friction were chosen to
 216 be close to the ones used in the work of Pasha (2013). The rolling friction model used in this work is
 217 the standard rolling friction model of EDEM®. The radii, Young's moduli and Poisson's ratios of the
 218 two particles in contact, along with the interface energy and the plastic yield stress, are direct inputs
 219 for a proprietary MATLAB code provided by Dr. Massih Pasha (The Chemours Company) that was used
 220 to compute k_e , k_p , k_t , k_{cp} , f_0 and f_{0p} , which in turn are inputs for the contact model used. Since each
 221 simulation contains a range of particle sizes, the different interface energy between particles of
 222 different radii needs to be considered. In this regard, the interface energy of particles of different size
 223 was scaled following the recommendation of Thakur *et al.* (2016) using Eq. (12).

224

$$\Gamma_{p2}/\Gamma_{p1} = (R_{p2}/R_{p1})^2 \quad (12)$$

225 where Γ_{p1} , Γ_{p2} and R_{p1} , R_{p2} , are the values of interface energy and the radii of particle size 1 and particle
 226 size 2, respectively. Subsequently, the stiffness values, f_0 and f_{0p} changed with size.

227 In each simulation the integration time-step, t_{sim} , was computed based on a mass-spring system by Eq.
 228 (13) (Pasha, 2013):

229

$$t_{sim} = 0.2 \sqrt{\frac{m_{smallest}}{k_{largest}}} \quad (13)$$

230 where $m_{smallest}$ is the mass of the smallest particle in the system and $k_{largest}$ is the largest stiffness in the
 231 system.

232 In all simulations carried out throughout this work, hardness was calculated using Eq. (1). For the
 233 calculation of the projected area of the impression of the indenter (Eq. (2)), the penetration depth at
 234 maximum indentation load was considered, assuming unloading has negligible effect on the simulated
 235 material's bed recovery. A 13.5 mm length cubic measurement cell (containing approximately 90 - 590
 236 particles) was created directly beneath and centrally aligned with the indenter, and its position was
 237 fixed relative to the indenter (Fig. 2b). The forces acting on every particle whose centre is within the
 238 measurement cell were calculated, and the ij -component of the stress tensor in the measurement cell,
 239 σ_{ij} , was determined following the approach of Bagi (1996) via Eq. (14):

$$240 \quad \sigma_{ij} = -\frac{1}{V_m} \sum_{N_p} \sum_{N_c} |x_i^c - x_i^p| n_i F_j \quad (14)$$

241 where V_m is the volume of the measurement cell, N_p is the number of particles in the measurement
 242 cell, N_c is the number of contacts around particle p , x_i^c , x_i^p and n_i are the i -components of contact
 243 location, particle centre location and normal vector directed from a particle centroid to its contact,
 244 respectively, and F_j is the j -component of the contact force. The term $|x_i^c - x_i^p|$ is approximately equal
 245 to the particle radius, therefore is replaced by particle radius in Eq. (14).

246 The deviatoric stress, τ_D , corresponding to the shear stress, was calculated using Eq. (15):

$$247 \quad \tau_D = \sqrt{\frac{(\sigma_1 - \sigma_3)^2 + (\sigma_1 - \sigma_2)^2 + (\sigma_3 - \sigma_2)^2}{6}} \quad (15)$$

248 where σ_1 , σ_2 and σ_3 , are the major, intermediate and minor principal stresses, respectively, which were
 249 determined from the nine components of the stress tensor.

250 In order to determine the constraint factor, it is necessary to know the hardness and the unconfined
 251 yield strength. The hardness can be determined in the DEM simulations using Eq. (1), however the

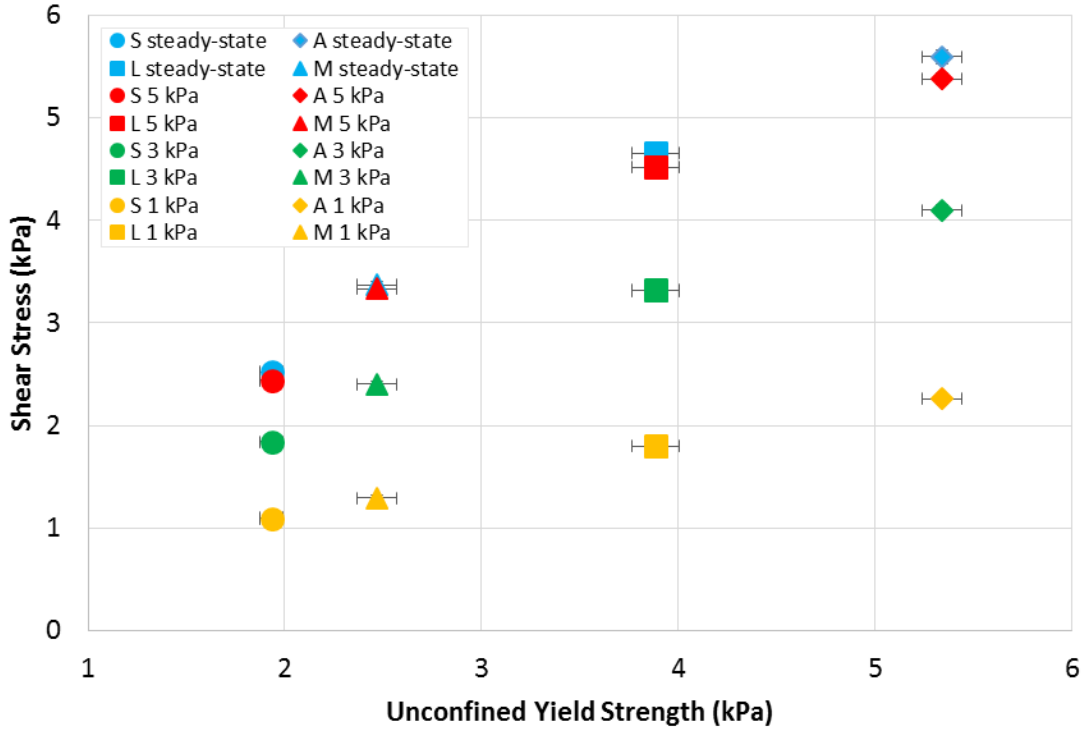
252 unconfined yield strength cannot be determined in the ball indentation simulations. As such, an
253 alternative method is needed. Stavrou (2019) experimentally assessed the flowability of a wide range
254 of powders in the FT4 shear cell. Fig. 4 shows the shear stresses and unconfined yield strengths of
255 measurements using a pre-shear stress of 6 kPa and applied stresses of 1, 2, 3, 4 and 5 kPa, for 63 - 75
256 μm silanised glass beads (S), alumina CT800SG (A), limestone (L) and maize starch (M). There is a
257 strong, approximately linear, relationship between the shear stress and the unconfined yield strength,
258 particularly at the lower applied stress of 1 kPa, which is closer to the failure Mohr circle. Therefore,
259 the term C' is used instead of the constraint factor, by using the deviatoric (shear) stress in place of
260 the unconfined yield strength, as shown in Eq. (16):

$$261 \quad C' = \frac{H}{\tau_D} \quad (16)$$

262 It is noted that C' will be larger than C , since deviatoric stress close to the failure Mohr circle (1 kPa in
263 Fig. 4) is smaller than unconfined yield strength, however it is proportional to C . Therefore, any trends
264 observed for C' also apply to C .

265

266



267

268 **Fig. 4.** Shear stress vs unconfined yield strength at a pre-shear normal stress of 6 kPa, showing
 269 steady-state and three points of incipient failure (first, third and fifth point). For 63 - 75 μm silanised
 270 glass beads, alumina CT800SG, limestone and maize starch, the abbreviations S, A, L and M are used
 271 respectively in the legend of this Figure.

272

273 3 Results and discussion

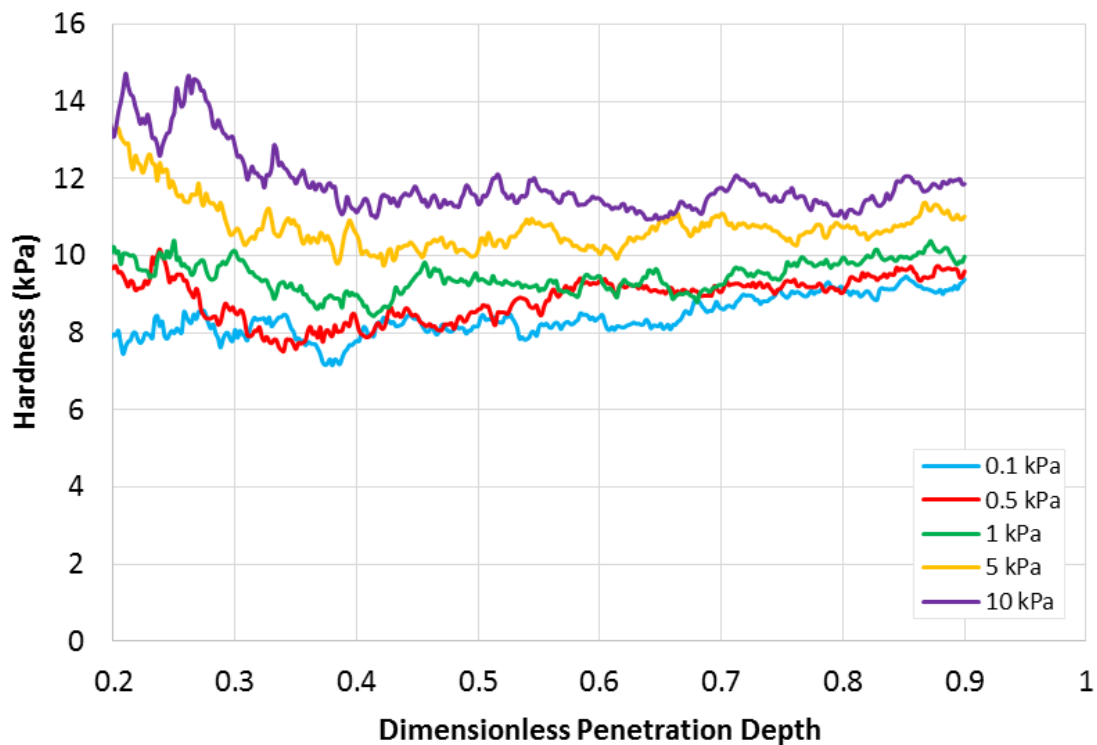
274 3.1 Effect of consolidation stress

275 In order to assess the behaviour of the constraint factor as a function of the applied stress, five
 276 different stresses, namely 0.1, 0.5, 1, 5 and 10 kPa, were applied to consolidate the powder bed prior
 277 to indentation. The default values of particle-particle and particle-wall interactions, highlighted in bold
 278 in Table 1, were used for all five simulations. Fig. 5 shows hardness against penetration depth based
 279 on the penetration depth at maximum indentation load, h_m , which is non-dimensionalised via Eq. (17)
 280 and presented as dimensionless penetration depth, h_d , in the range of 0.2 - 0.9, at all five pre-
 281 consolidation stresses.

282

$$h_d = \frac{2h_m}{d_b} \quad (17)$$

283 Hardness is overestimated at very shallow depths due to the limited number of contacts and therefore
284 inaccuracy in estimating the projected area of the impression, hence the dimensionless penetration
285 depth of 0.2 was considered as the minimum depth for data analysis. Hardness is found to increase
286 with applied stress, and is virtually independent of penetration depth beyond a dimensionless
287 penetration depth of 0.4, though some fluctuations are present. Greater pre-consolidation stresses
288 lead to more tightly packed powder beds, hence hardness increases due to an increased packing
289 fraction, as shown in Fig. 6, where the packing fraction at maximum compression is plotted against
290 pre-consolidation stress. Also, it can be seen that as the pre-consolidation stress is increased, the
291 minimum depth required to reach the stable hardness region increases, with the threshold being a
292 dimensionless penetration depth of about 0.2 and 0.4 in the cases of beds compressed at 0.1 and 10
293 kPa, respectively.
294



295
296 **Fig. 5.** Hardness against dimensionless penetration depth at five pre-consolidation stresses.
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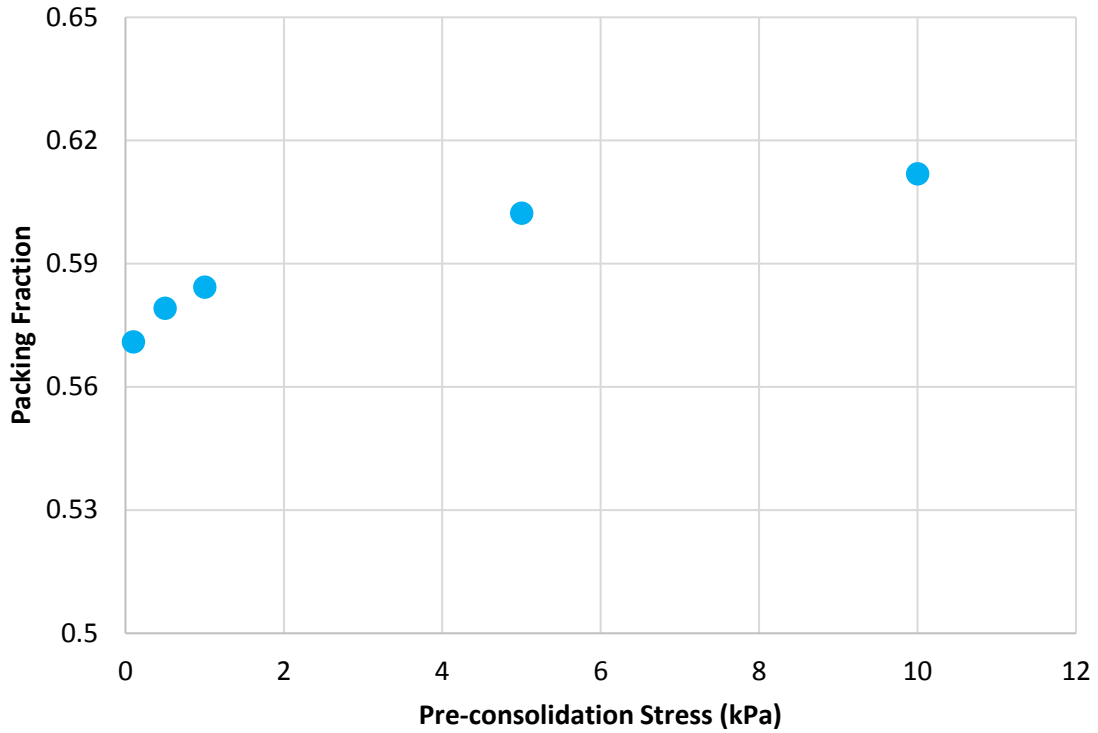


Fig. 6. Packing fraction against pre-consolidation stress.

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301 Fig. 7 shows the deviatoric stress against dimensionless penetration depth for the five pre-

302 consolidation stresses. There is a general increase in deviatoric stress with pre-consolidation stress,

303 while it does not exhibit any general increases or decreases with penetration depth. It is noteworthy

304 that significant fluctuations occur, which are more significant than the fluctuations of hardness. Such

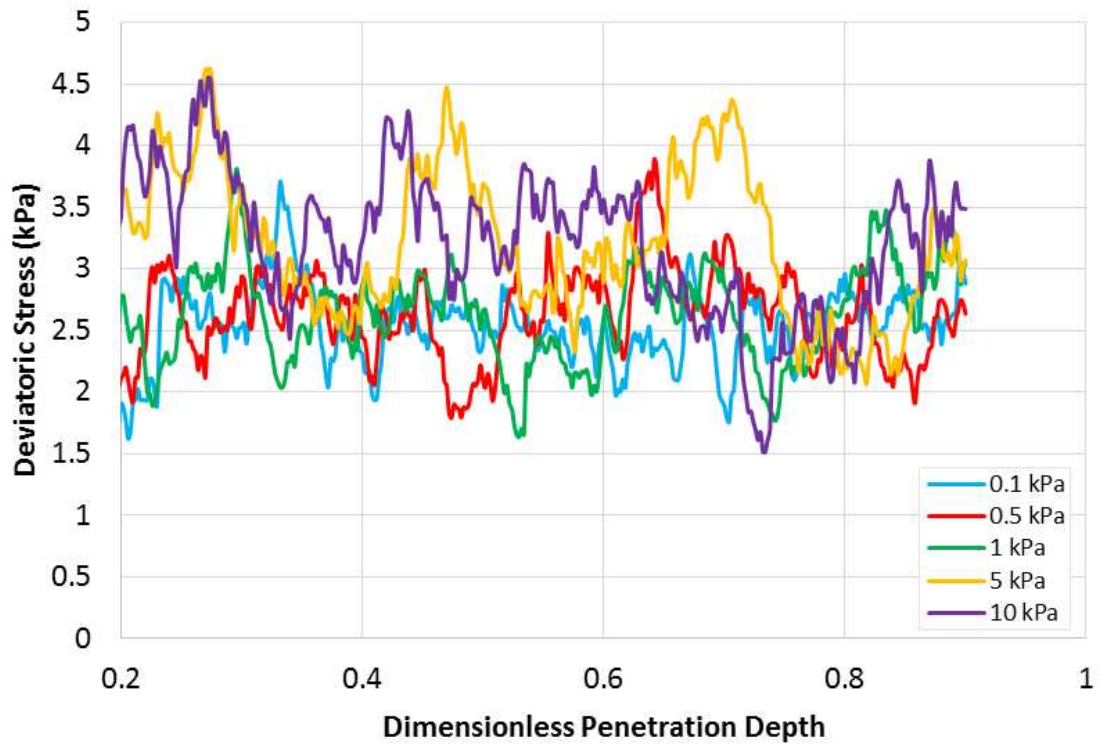
305 fluctuations are common in DEM simulations, due to the sudden changes in force at individual

306 contacts and the high sampling frequency. Simulations could be repeated using different initial particle

307 positions in order to determine average values against depth, and therefore reduce the inherent

308 fluctuations, however the data presented in this work is taken from individual simulations of each

309 condition.

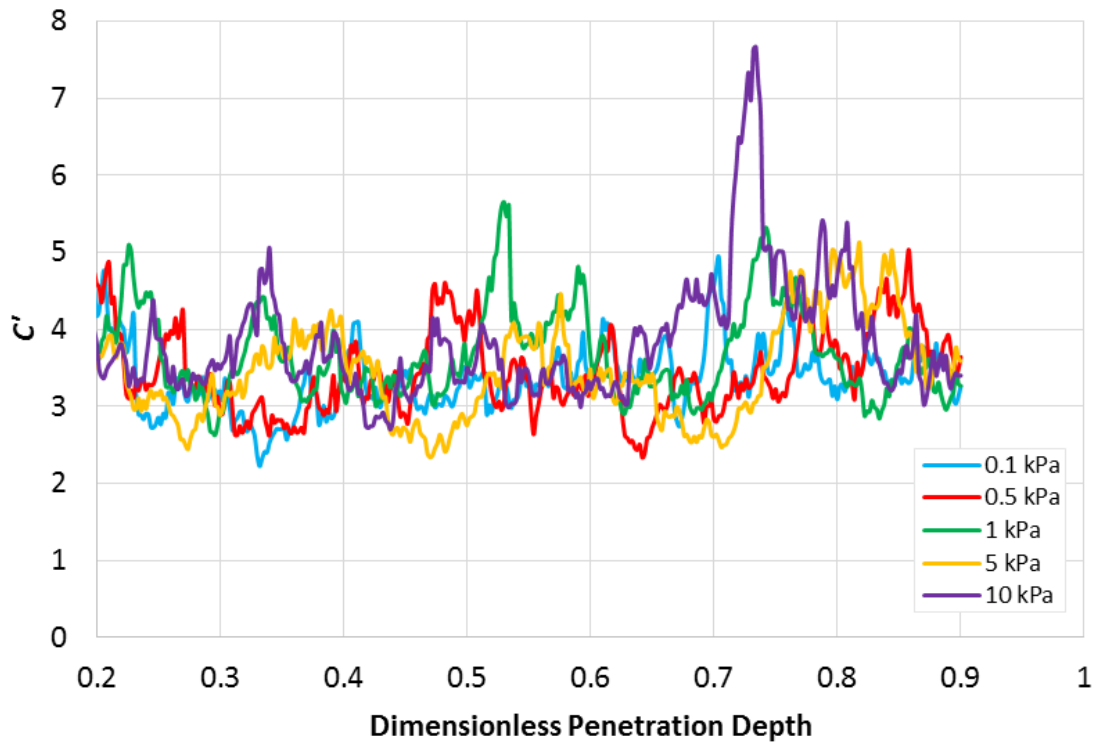


310
 311 **Fig. 7.** Deviatoric stress against dimensionless penetration depth at five pre-consolidation stresses.

312
 313 Using Eq. (16), C' was quantified, and is plotted as a function of dimensionless penetration depth at
 314 all five pre-consolidation stresses in Fig. 8. C' is found to fluctuate around a fixed value for a given pre-
 315 consolidation stress, being virtually constant and independent of the pre-consolidation stress applied.
 316 In addition to this, the average C' was calculated through the dimensionless penetration depth range
 317 of 0.4 - 0.8, and is presented against pre-consolidation stress in Fig. 9, with error bars showing the
 318 standard deviation throughout this penetration depth range. Fig. 9 confirms that the average C'
 319 remains relatively constant throughout the range of pre-consolidation stresses. Experimentally it isn't
 320 possible to compute C at such low stresses (≤ 1 kPa), due to the inability of shear cells to give reliable
 321 and repeatable results in this stress range, however constraint factor has been shown experimentally
 322 to be independent of stress above this low stress range (Wang *et. al*, 2008; Zafar, 2013). The fact that
 323 constraint factor remains constant at low stresses means that it is possible to determine constraint
 324 factor from hardness and unconfined yield strength measurements at moderate to high stresses by
 325 performing ball indentation and shear cell experiments, respectively, and use the same value of

326 constraint factor in order to infer the unconfined yield strength of powders from ball indentation
327 measurements at low stresses.

328

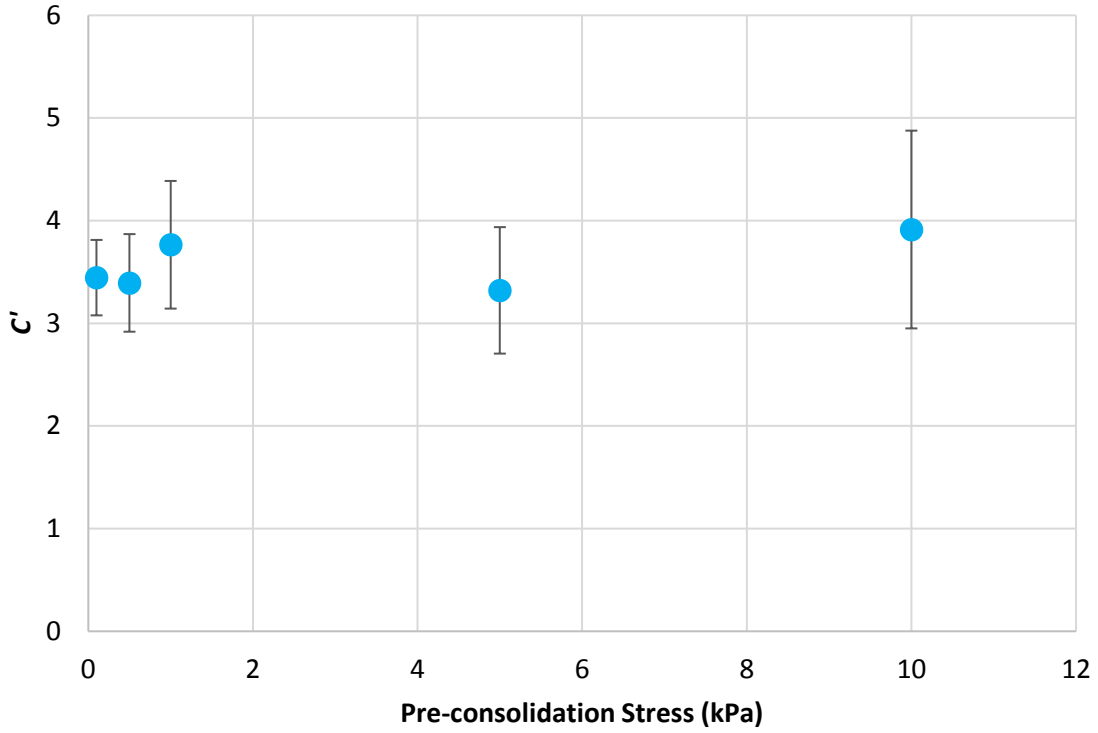


329

330

Fig. 8. C' against dimensionless penetration depth at five pre-consolidation stresses.

331



332 **Fig. 9.** Average C' in the depth range of 0.4 - 0.8 against pre-consolidation stress.

334

335 3.2 Effect of interface energy

336 In this series of simulations, powder beds of five different values of interparticle interface energy,
 337 namely 1, 2, 5, 10 and 20 J/m², were consolidated at 1 kPa and penetrated by the indenter. These high
 338 values of interface energy were chosen due to the large particle size, and correspond to Cohesion
 339 numbers, Coh , of 0.023 - 3.45 computed from Eq. (18) (Alizadeh *et al.*, 2018), which are equivalent to
 340 interface energies of 9×10^{-3} to 0.18 mJ/m² for 100 μ m particles.

341
$$Coh = \frac{1}{\rho g} \left(\frac{\Gamma^5}{E^{*2} R^{*8}} \right)^{1/3} \quad (18)$$

342 where ρ is the envelope density of the particles and E^* is the reduced Young's modulus given by Eq.

343 (19):

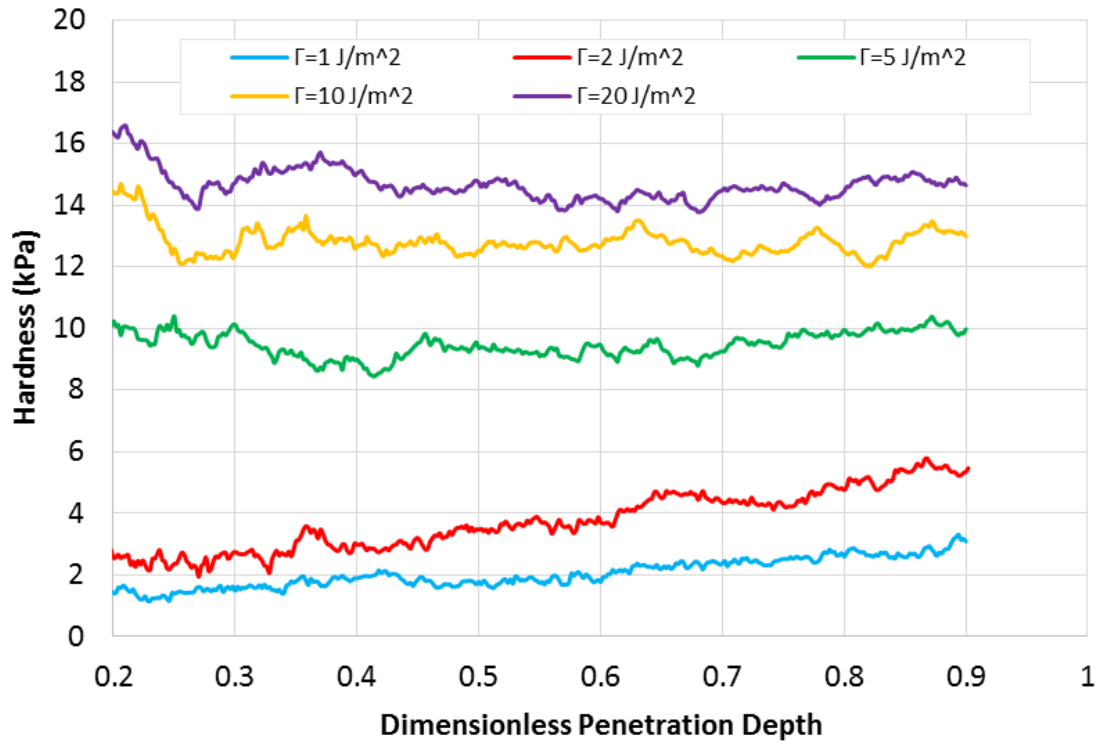
344

345
$$E^* = \left(\frac{1 - \nu_1^2}{E_1} + \frac{1 - \nu_2^2}{E_2} \right)^{-1} \quad (19)$$

346 where E_1 and E_2 , and ν_1 and ν_2 are the Young's moduli and Poisson's ratios of the two elements in
347 contact, respectively.

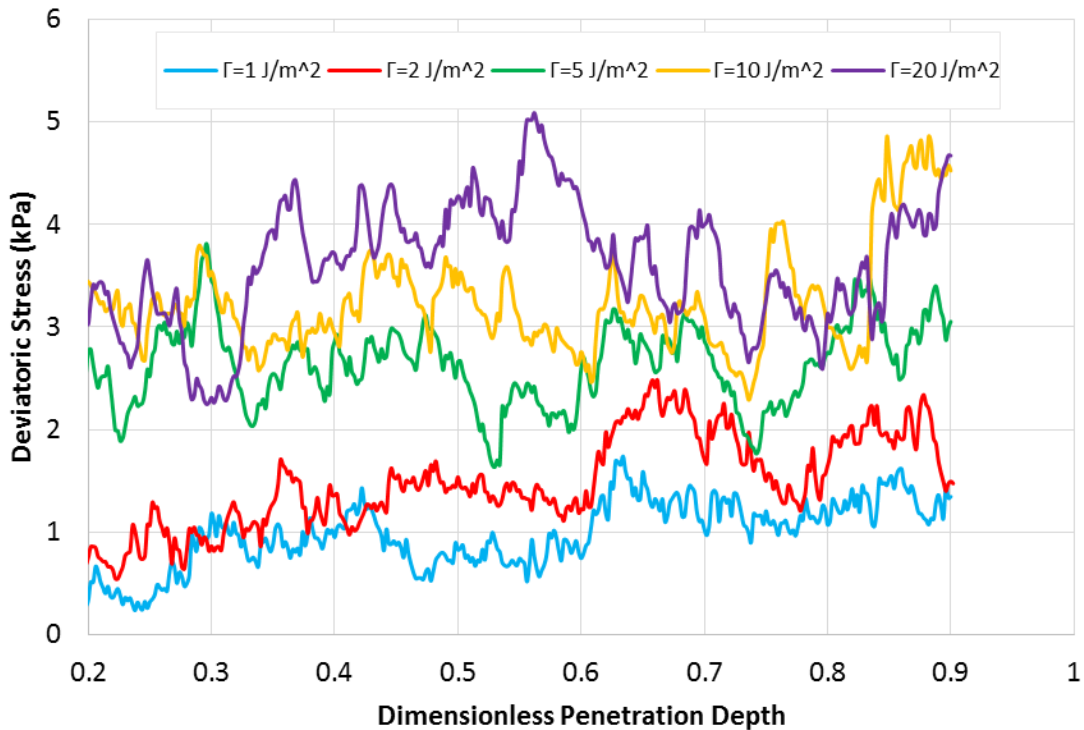
348 All five simulations were carried out with the default values given in Table 1 (indicated in bold), except
349 for the interparticle interface energy. In Fig. 10 hardness is shown against dimensionless penetration
350 depth for all five values of interface energy. In the case of the two powder beds with the lowest values
351 of interface energy, hardness increases continually with depth. This may indicate that for these
352 relatively cohesionless powders the bed is consolidated during the indentation test, though it is not
353 clear why this is the case. The fact that no stable hardness region is found for these cohesionless
354 powders renders the measurement unreliable. For the middle value of interparticle interface energy,
355 hardness is constant across the whole range of penetration depths, while for the two higher values of
356 interface energy it exhibits the same behaviour beyond a dimensionless penetration depth of around
357 0.25. An increased interface energy results in greater cohesion, and therefore greater resistance to
358 plastic deformation. The deviatoric stress variation with depth is shown for each interface energy
359 value in Fig. 11. Although notable fluctuations exist, there is an increase of deviatoric stress with
360 increasing interface energy. Qualitatively similar findings have been reported in the work of Pasha
361 (2013).

362



363

364 **Fig. 10.** Hardness against dimensionless penetration depth for five different values of interface
 365 energy.

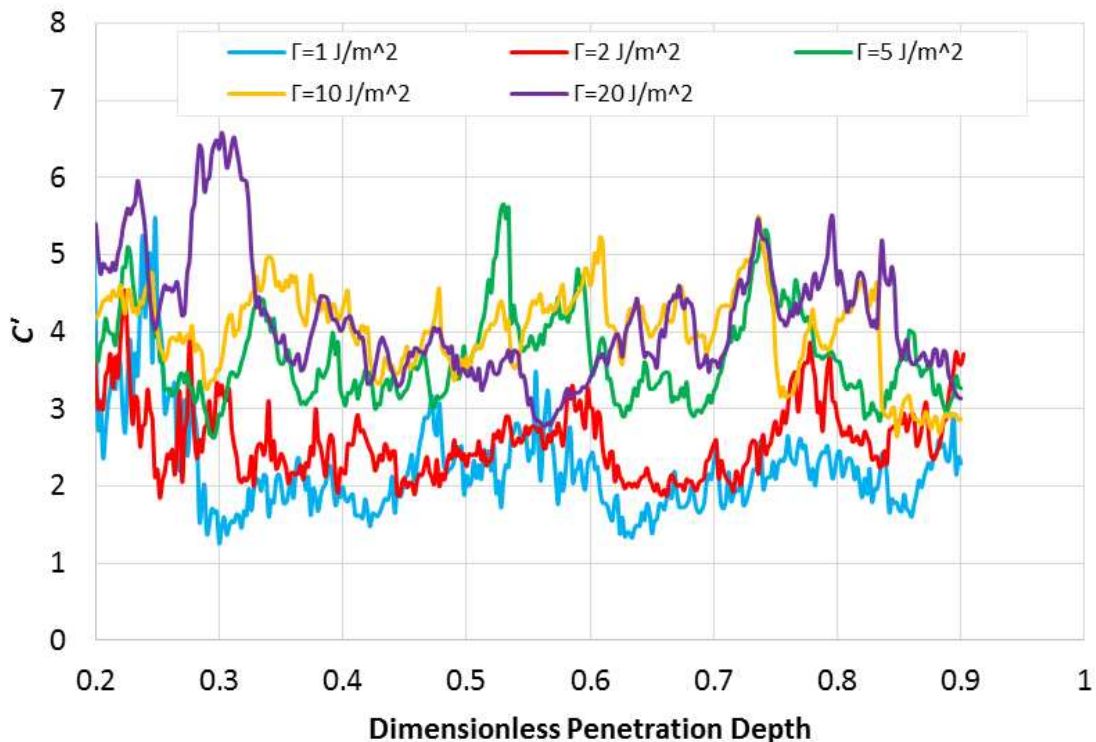


366

367 **Fig. 11.** Deviatoric stress against dimensionless penetration depth for five different values of
 368 interface energy.

369

370 Fig. 12 shows C' against dimensionless penetration depth, where for a given value of interface energy
371 C' fluctuates around a fixed value beyond a dimensionless penetration depth of 0.4. There is a general
372 increase of C' with interface energy, as the interface energy is increased from 2 to 5 J/m². This
373 behaviour is seen more clearly in Fig. 13, where the average value of C' in the dimensionless
374 penetration depth range of 0.4 - 0.8 is presented against interface energy. An increase in interface
375 energy from 1 to 2 J/m² leads to a slight increase of C' , while a further increase to 5 J/m² results in a
376 substantial increase in C' , from around 2.5 to around 3.8. It should be noted that 5 J/m² is the lowest
377 value of interface energy applied for which the powder bed does not appear to be consolidated during
378 indentation. A further increase of interface energy from 5 to 20 J/m² leads to no significant change in
379 the value of C' . This suggests that for powder beds that are sufficiently cohesive to be tested by ball
380 indentation, interface energy does not influence the constraint factor.



381

382 **Fig. 12.** C' against dimensionless penetration depth for five different values of interface energy.

383

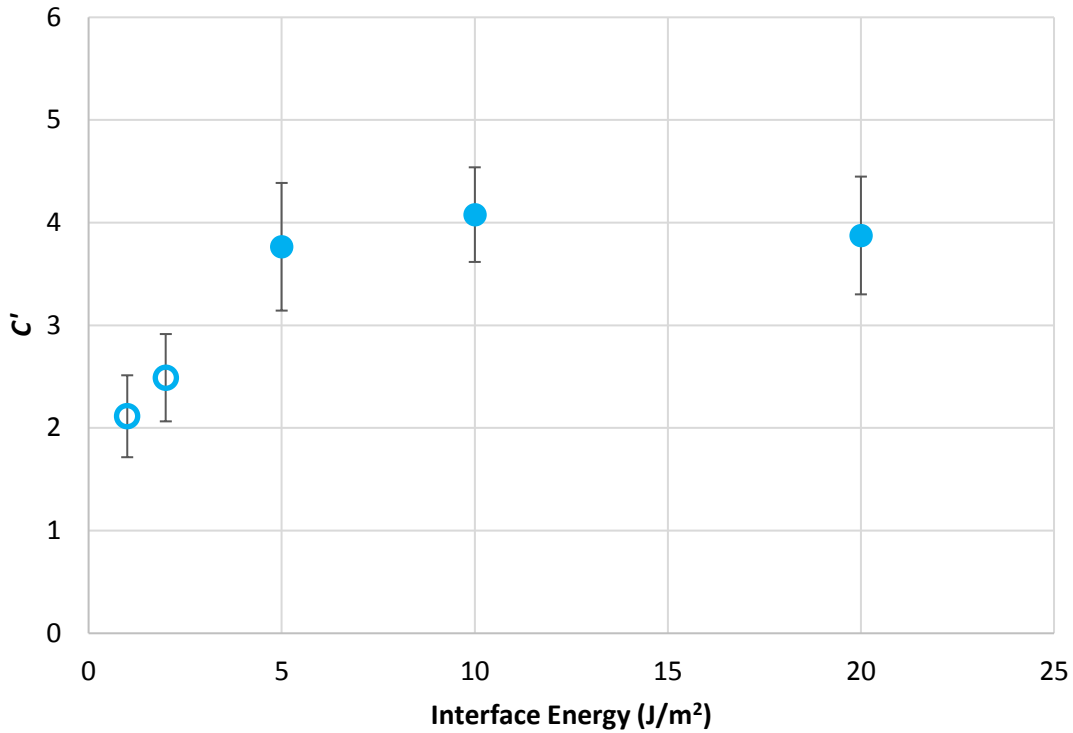
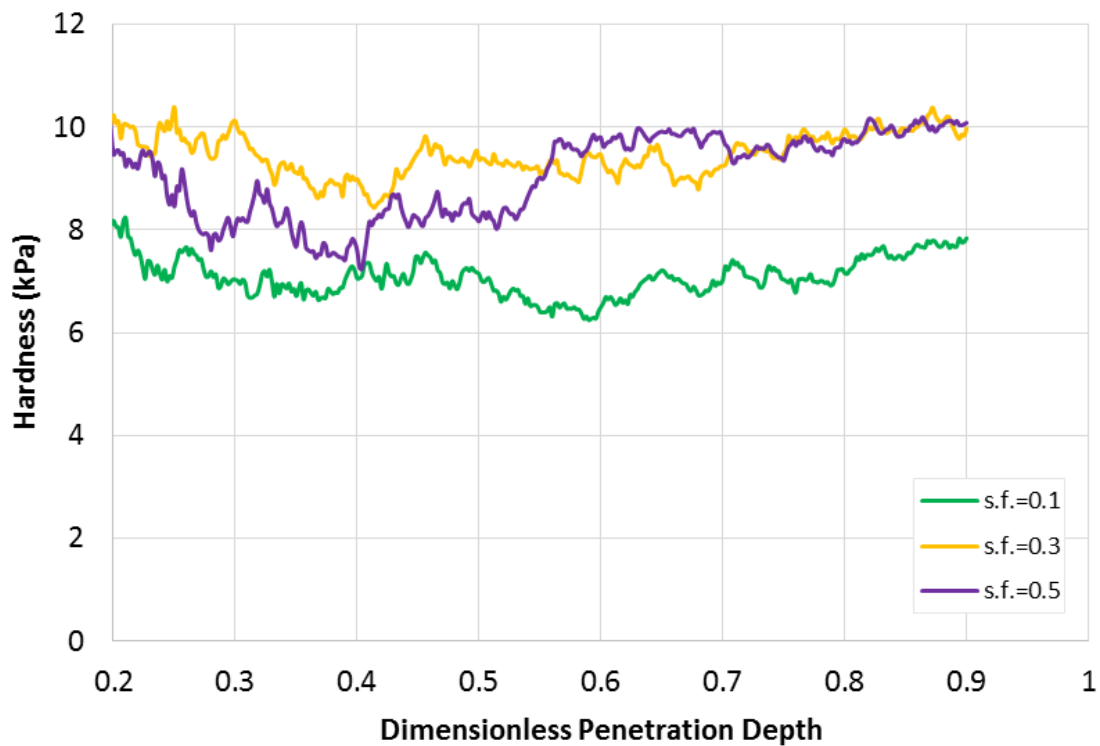


Fig. 13. Average C' in the depth range of 0.4 - 0.8 against interface energy.

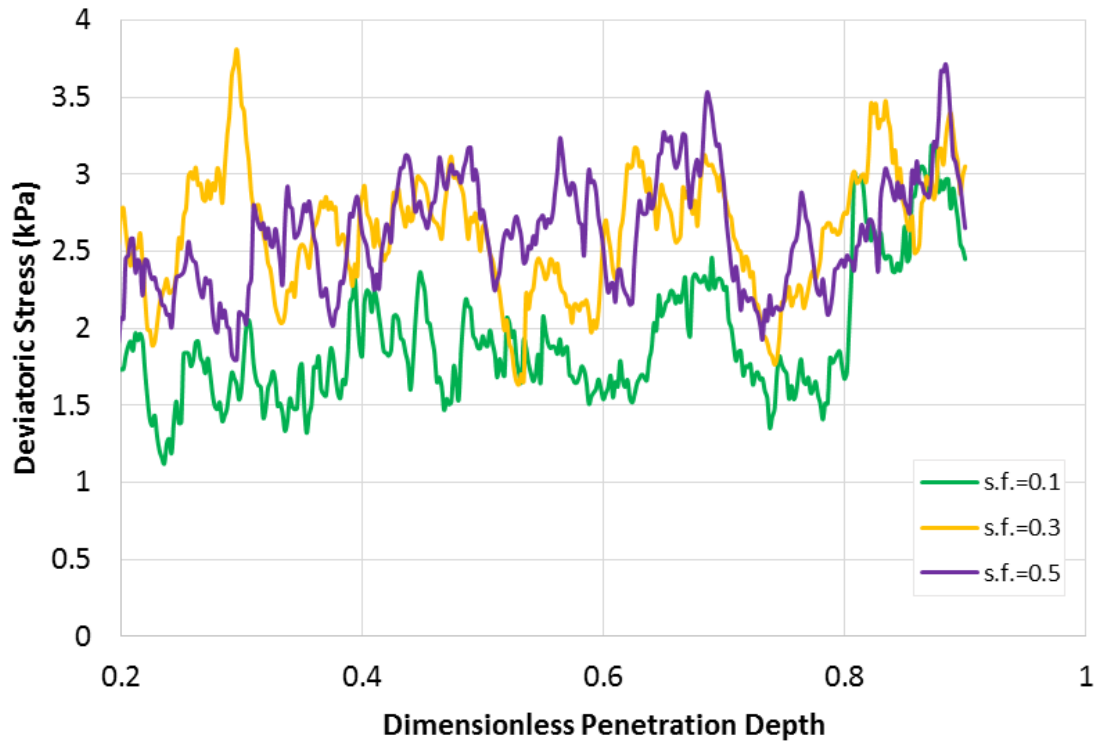
3.3 Effect of static friction

Three simulations of ball indentation at 1 kPa pre-consolidation stress were run using different values of the coefficient of static friction for interparticle interactions. All the other simulation parameters were given the default values from Table 1. Fig. 14 shows the hardness variation with penetration depth for the different values of static friction coefficient. It can be seen that μ_s values of 0.1 and 0.3 lead to a constant hardness throughout the range of dimensionless penetration depths presented, whereas when the interparticle friction is further increased to 0.5 the hardness is relatively constant in the depth range of 0.3 - 0.5, but then increases notably at a depth of around 0.5, from which point onwards it remains relatively constant. In contrast to this, it can be seen in Fig. 15 that the deviatoric stress fluctuates around a relatively constant value until a dimensionless penetration depth of 0.8, beyond which it increases for all coefficient of static friction values. Also, increasing the static friction coefficient from 0.1 to 0.3 leads to an increase of deviatoric stress, whilst increasing μ_s to 0.5 leads to no further increase. It is expected that increased friction will result in a greater internal resistance to

400 shear deformation, but after a certain level of static friction ($\mu_s = 0.3$ in this case), Coulomb's sliding
401 criterion is not met by the particle's tangential force in certain contacts, and as such contact sliding
402 does not take place. For these non-sliding contacts, a further increase in coefficient of static friction
403 does not lead to any increase in the shear stress, since these contacts remain in a non-sliding
404 condition. This finding agrees with the work of Gröger and Katterfeld (2006) and Pasha (2013), who
405 also showed a limiting μ_s beyond which the shear stress does not increase.



406
407 **Fig. 14.** Hardness against dimensionless penetration depth for three different values of coefficient of
408 static friction.



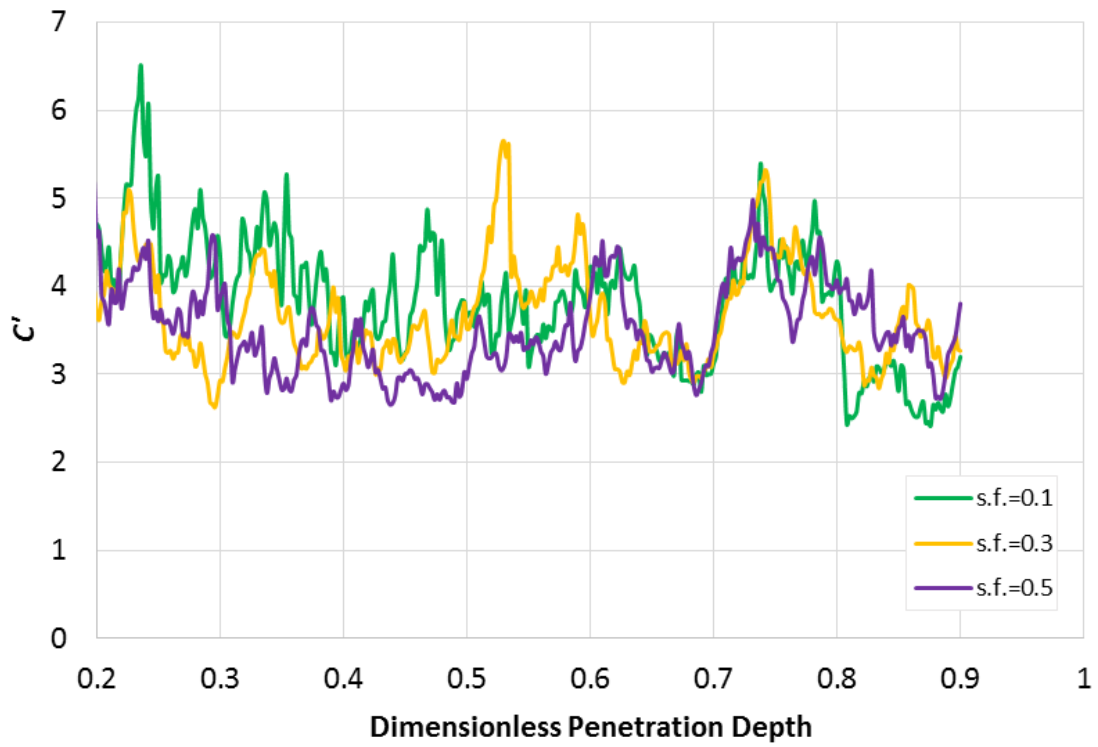
409

410 **Fig. 15.** Deviatoric stress against dimensionless penetration depth for three different values of
 411 coefficient of static friction.

412

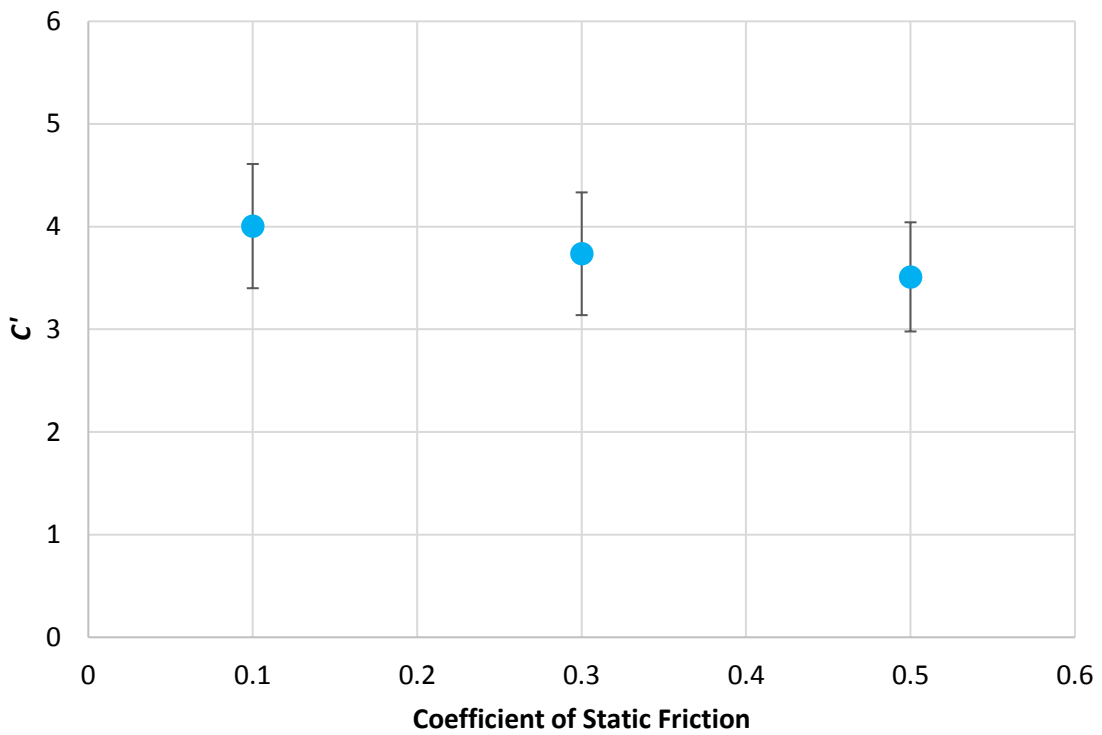
413 Fig. 16 shows C' against dimensionless penetration depth for all three values of μ_s . As can be seen, C'
 414 is relatively constant regardless of the applied penetration depth, but it is not clear whether static
 415 friction has any influence on C' , since it fluctuates around a similar value for all values of the coefficient
 416 of static friction. Fig. 17 shows the average C' in the dimensionless penetration depth range of 0.2 -
 417 0.8, which displays a slight reduction with an increase of the coefficient of static friction. However,
 418 since the error bars are large, this result is considered to be statistically insignificant.

419



420

421 **Fig. 16.** C' against dimensionless penetration depth for three different values of coefficient of static
 422 friction.



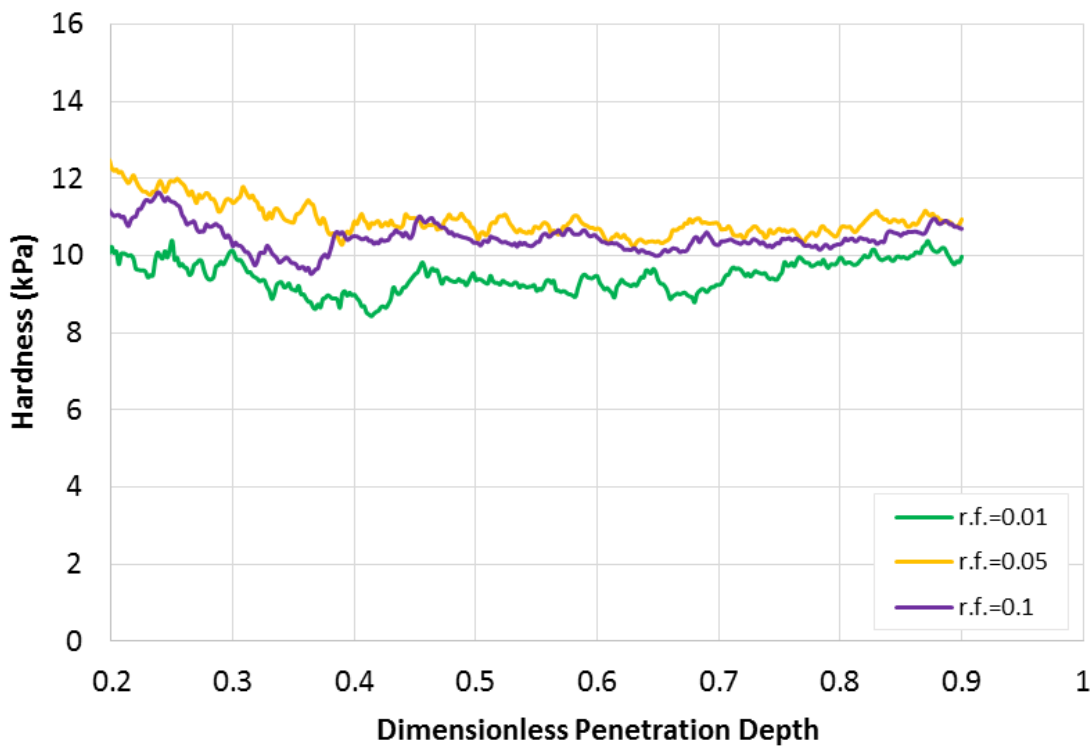
423

424 **Fig. 17.** Average C' in the depth range of 0.2 - 0.8 against coefficient of static friction.

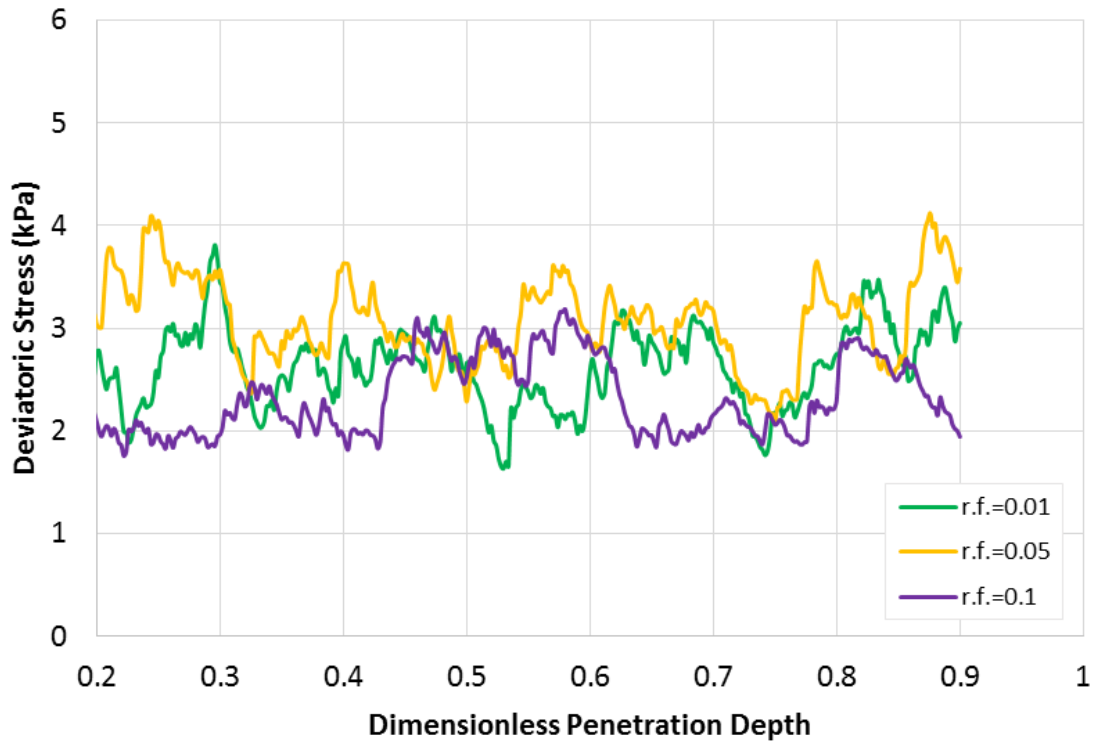
425

426 3.4 Effect of rolling friction

427 Ball indentation simulations at 1 kPa pre-consolidation stress were carried out for three different
428 values of coefficient of interparticle rolling friction, whilst the default values from Table 1 were used
429 for the other simulation parameters. Fig. 18 shows that an increase in μ_r from 0.01 to 0.05 leads to an
430 increased hardness, whilst further increase to a value of 0.1 leads to an almost negligible reduction of
431 hardness. In all cases, hardness remains constant beyond a dimensionless penetration depth of 0.4.
432 Fig. 19 shows that the deviatoric stress exhibits the same behaviour against penetration depth as
433 hardness, whilst it shows that increasing the rolling friction coefficient from 0.01 to 0.05 results in a
434 slight increase of the shear stress, but further increasing it to 0.1 results in a clear reduction of shear
435 stress. This reduction in shear stress could be due to a decrease in packing fraction, which translates
436 to a smaller force required for shearing.



437
438 **Fig. 18.** Hardness against dimensionless penetration depth for three different values of coefficient of
439 rolling friction.



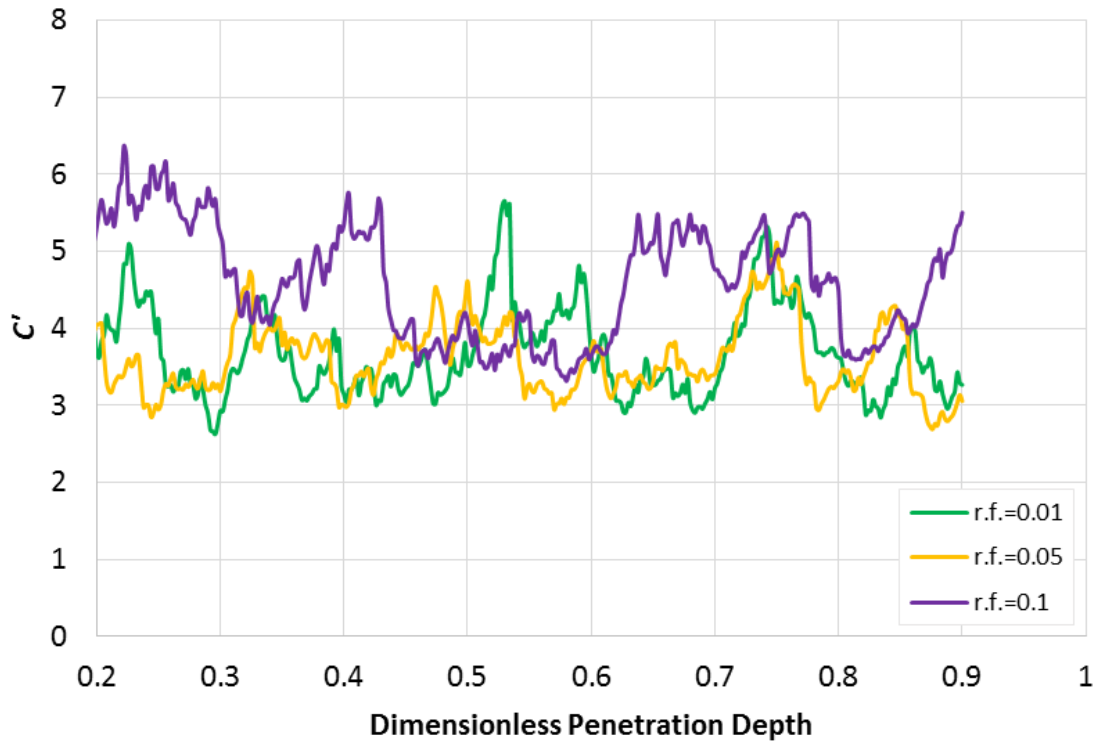
440

441 **Fig. 19.** Deviatoric stress against dimensionless penetration depth for three different values of
 442 coefficient of rolling friction.

443

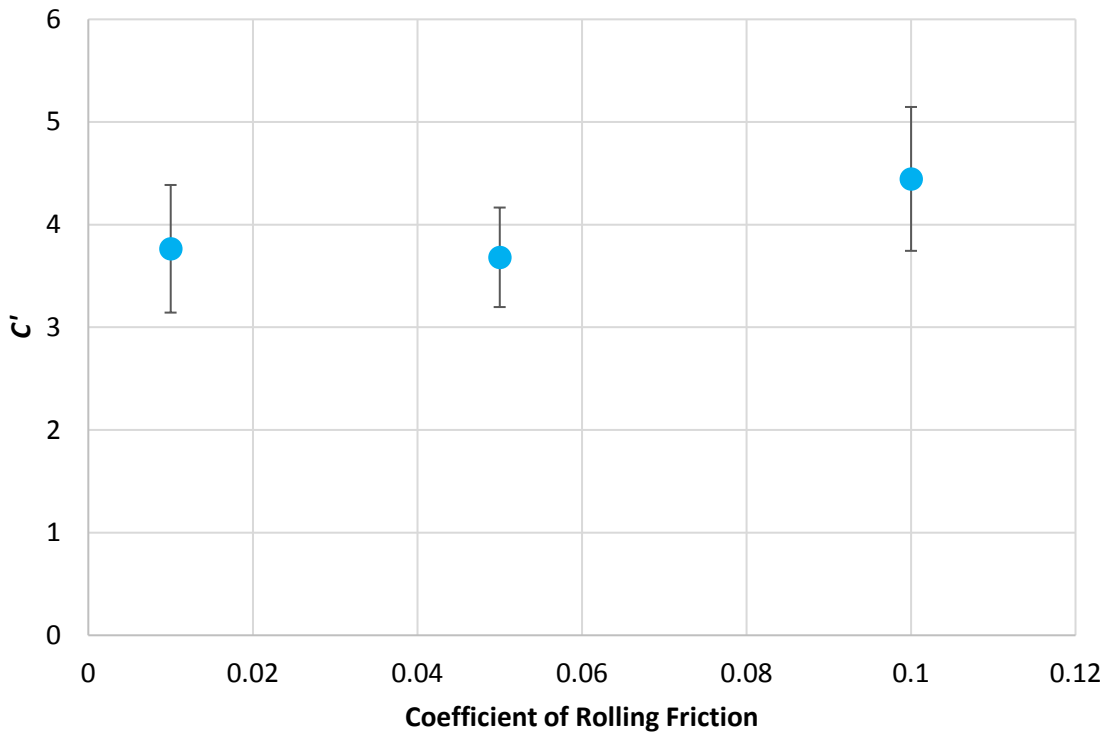
444 For all values of coefficient of rolling friction, C' is observed to fluctuate around a fixed value
 445 throughout the range of applied penetration depths, with the fluctuations being larger for $\mu_r = 0.1$ (Fig.
 446 20). The average C' value in the range of 0.4 - 0.8 dimensionless penetration depth is found to be
 447 independent of the coefficient of rolling friction as it is increased from 0.01 to 0.05, and then to
 448 substantially increase from around 3.5 to around 4.5 with a further increase of μ_r to a value of 0.1 (Fig.
 449 21).

450



451

452 **Fig. 20.** C' against dimensionless penetration depth for three different values of coefficient of rolling
 453 friction.



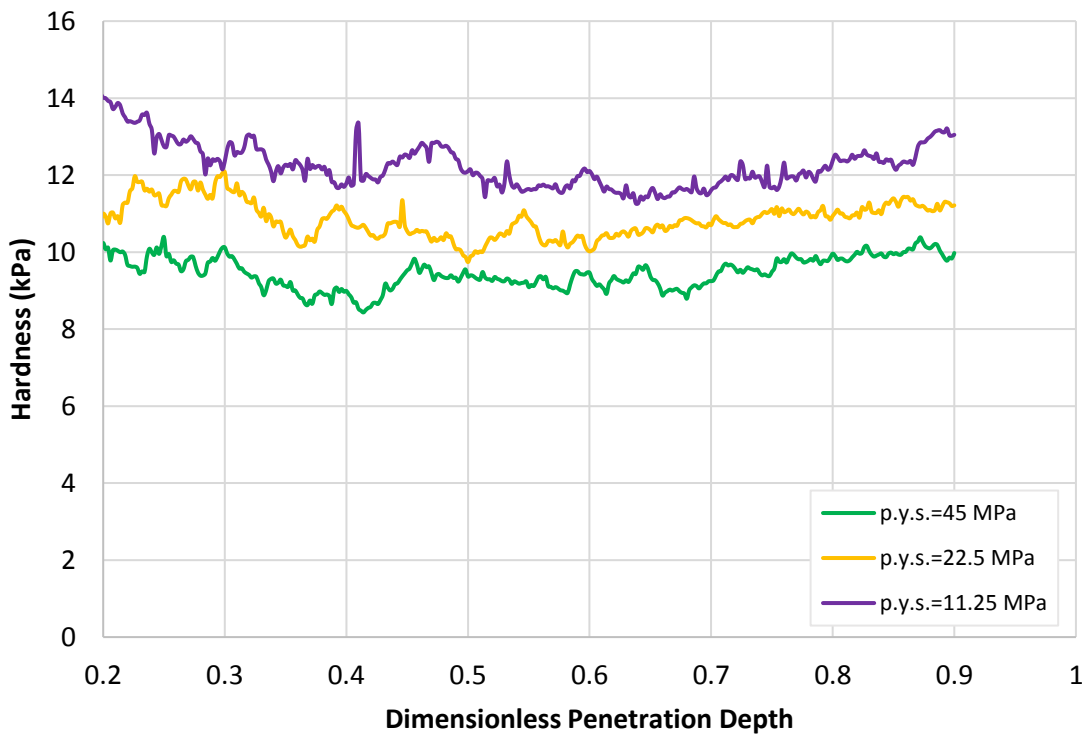
454

455 **Fig. 21.** Average C' in the depth range of 0.4 - 0.8 against coefficient of rolling friction.

456

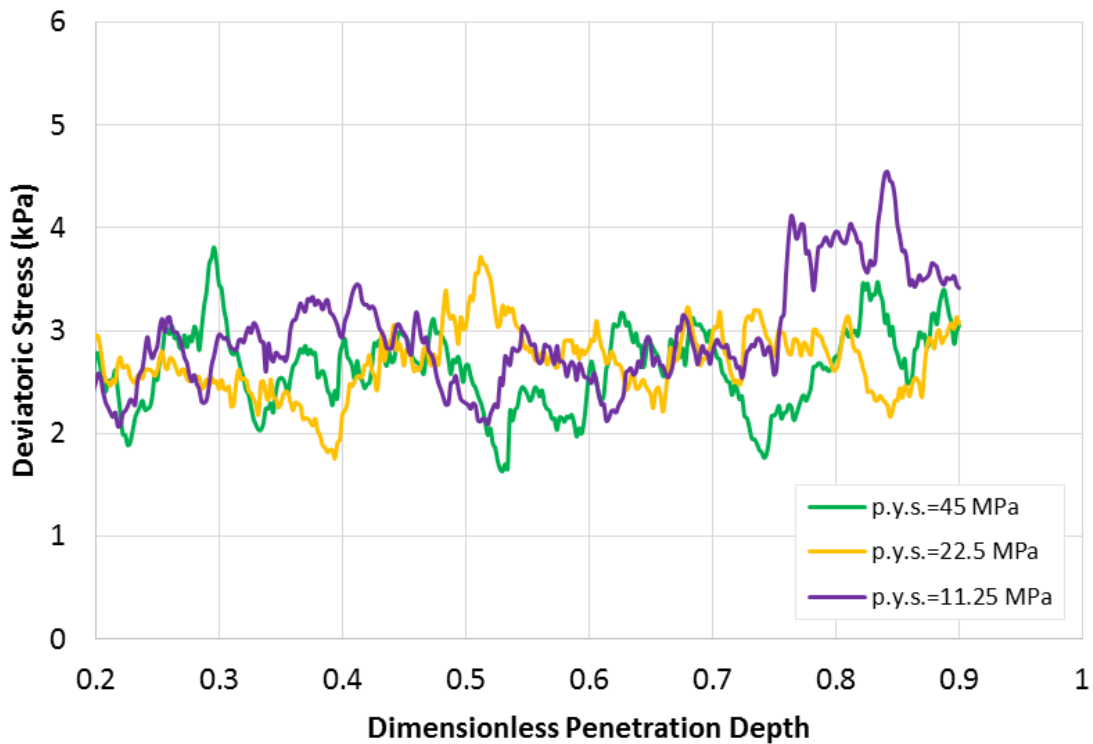
457 3.5 Effect of plastic yield stress

458 Ball indentation simulations at 1 kPa pre-consolidation stress were carried out for three different
459 values of plastic yield stress (σ_y), while all other parameters were given the default values from Table
460 1. The hardness variation with penetration depth is shown for the different values of σ_y in Fig. 22. Fig.
461 22 shows that as the plastic yield stress is increased the hardness decreases, which can be explained
462 as follows. Since a higher plastic yield stress means that a greater stress needs to be overcome in order
463 for plastic deformation to initiate, then the number of particles which plastically deform, and
464 therefore create cohesive contacts, decreases. Therefore, since fewer cohesive contacts exist for
465 higher plastic yield stress, then the hardness of the bed is lower. In addition to this, hardness is seen
466 to remain relatively constant with depth for all values of σ_y . In contrast to hardness, the exerted shear
467 stresses do not seem to be influenced by the plastic yield stress, as indicated in Fig. 23.



468

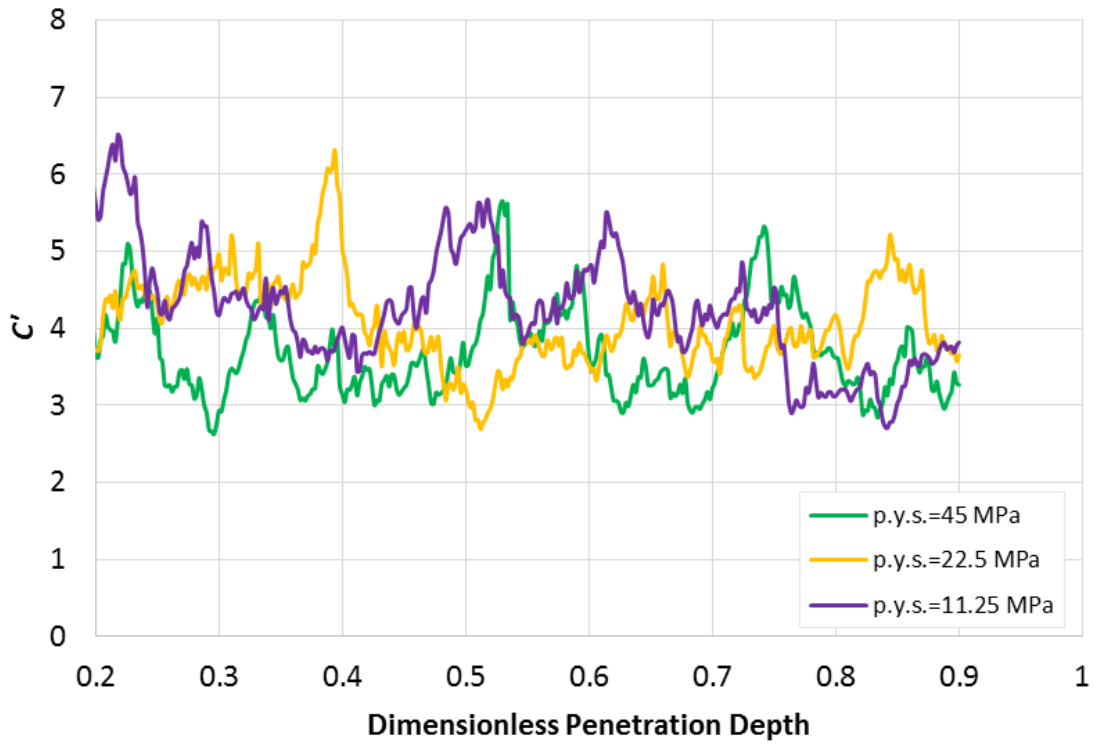
469 **Fig. 22.** Hardness against dimensionless penetration depth for three different values of plastic yield
470 stress.



471 **Fig. 23.** Deviatoric stress against dimensionless penetration depth for three different values of
472 plastic yield stress.
473

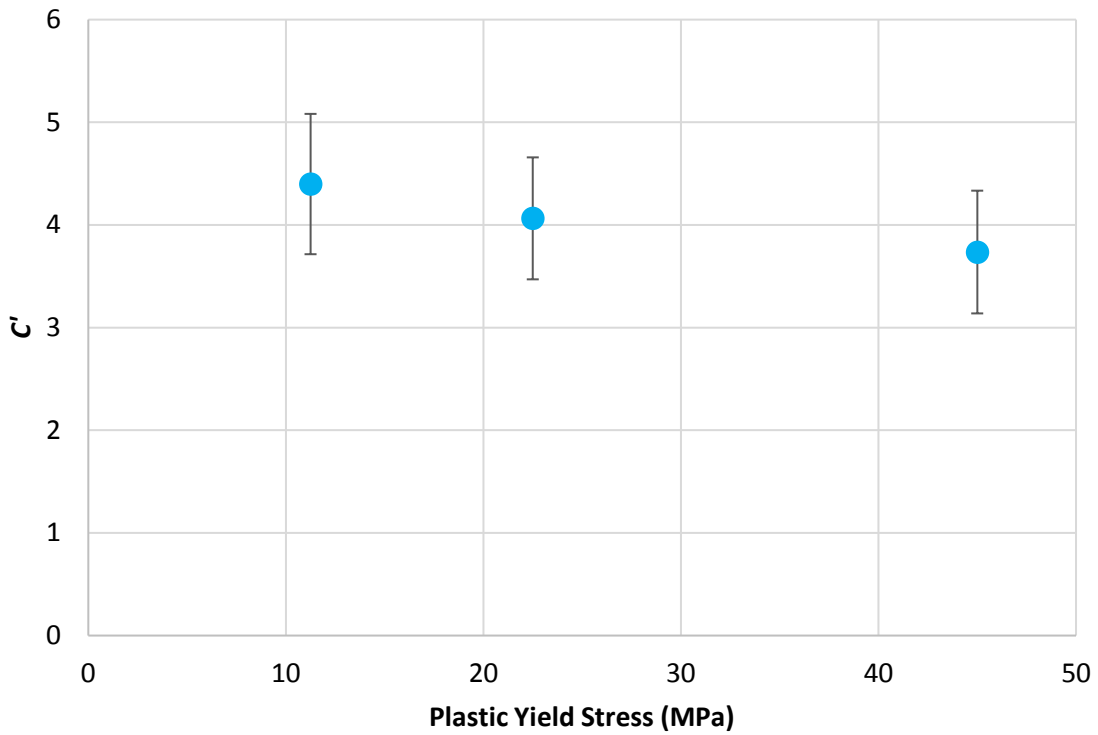
474 C' is plotted against dimensionless penetration depth in Fig. 24, and is shown to be relatively constant
475 across the whole range of penetration depths, regardless of the plastic yield stress. Furthermore, in
476 Fig. 25 the average C' in the range of 0.2 - 0.8 dimensionless penetration depth is depicted against
477 plastic yield stress, and is found to decrease with the increase of plastic yield stress, though noticeable
478 error is present.
479

480



481

482 **Fig. 24.** C' against dimensionless penetration depth for three different values of plastic yield stress.



483

484

Fig. 25. Average C' in the depth range of 0.2 - 0.8 against plastic yield stress.

485

486 In both DEM and experiments, fluctuations always arise due to constant rearrangement and
487 deformation of the particle contacts. Throughout all the simulations using the range of properties
488 defined in Table 1, the fluctuations in C' , which are predominantly caused by fluctuations in deviatoric
489 stress (e.g. Fig. 23), are of similar magnitude. Comparing to the experimental results of Zafar (2013) it
490 can be seen that the force fluctuations are greater in the DEM simulations. The increased fluctuations
491 in DEM simulations, as compared to experiments, are attributed to the sampling frequency in DEM,
492 100 Hz in this work, whereas most experimental equipment only provide data at much lower
493 frequencies. Furthermore, real materials usually behave in a more ductile manner than represented
494 in DEM, and hence reduced fluctuations would be expected.

495 **4 Conclusions**

496 The ball indentation method was simulated using DEM. Hardness and localised shear stresses directly
497 beneath the indenter were calculated and the effective constraint factor was determined. Ball
498 indentation simulations at different pre-consolidation stresses in the range of 0.1 - 10 kPa showed
499 that both hardness and the shear stress increased with an increase in pre-consolidation stress, whilst
500 C' was found to be independent of the applied pre-consolidation stress. This finding is in agreement
501 with trends previously determined experimentally by Wang *et al.* (2008) and Zafar (2013), however
502 these results demonstrate that this remains the case down to very low stresses, beyond the range
503 that could be determined experimentally.

504 In addition to this, the influence of a number of particle properties on the exerted stresses and the
505 constraint factor was studied by independently varying each property, in an effort to reach the aim of
506 defining constraint factor as a function of these properties. An increase in interparticle interface
507 energy was shown to lead to an increase in hardness and deviatoric stress, and an increase in the
508 effective constraint factor for relatively cohesionless particles, however the effective constraint factor
509 was found to be independent of interface energy for cohesive particles. An increase of interparticle
510 static friction coefficient resulted in an increase of hardness and shear stress, up to a certain point (μ_s

511 = 0.3), after which they remained relatively constant, whilst an increased interparticle rolling friction
512 coefficient from 0.01 to 0.05 led to increases in both hardness and deviatoric stress, with a further
513 increase causing them to reduce. The effective constraint factor steadily decreased with increased
514 static friction, although the error bars are noticeable, while it significantly increased when μ_r was
515 increased from 0.05 to 0.1. Lastly, an increase in the plastic yield stress led to a decrease in hardness,
516 though did not influence the deviatoric stress, hence the effective constraint factor was reduced.

517 Further work is required to fully account for the full range of particle properties which may influence
518 constraint factor. One particular challenge is to determine a suitable shape descriptor to fully account
519 for shape effects.

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524 model used in this work.

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