Stress-strain behavior and geometrical properties of packings of elongated particles

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We present a numerical analysis of the effect of particle elongation on the quasistatic behavior of sheared granular media by means of the contact dynamics method. The particle shapes are rounded-cap rectangles characterized by their elongation. The macroscopic and microstructural properties of several packings subjected to biaxial compression are analyzed as a function of particle elongation. We find that the shear strength is an increasing linear function of elongation. Performing an additive decomposition of the stress tensor based on a harmonic approximation of the angular dependence of branch vectors, contact normals, and forces, we show that the increasing mobilization of friction force and the associated anisotropy are key effects of particle elongation. These effects are correlated with partial nematic ordering of the particles which tend to be oriented perpendicular to the major principal stress direction and form side-to-side contacts. However, the force transmission is found to be mainly guided by cap-to-side contacts, which represent the largest fraction of contacts for the most elongated particles. Another interesting finding is that, in contrast to shear strength, the solid fraction first increases with particle elongation but declines as the particles become more elongated. It is also remarkable that the coordination number does not follow this trend so that the packings of more elongated particles are looser but more strongly connected.

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I. INTRODUCTION

The research for a better understanding of the complex rheology of granular media is enriched by an increasing focus on nonspherical particles [1-10]. The widespread use of spherical or disklike particles has been motivated by the fact that the rheology of granular media is basically governed by the collective contact interactions of the particles so that the particle shape can be viewed as a secondary effect. In practice, both in experiments and discrete element simulations, the spherical or circular particles, such as glass beads and disks, are easier to handle and the results are generally more directly amenable to theoretical analysis. However, owing to the fast progress in experimental and numerical techniques during the last decade, there is now a wide scope for the investigation of materials composed of more complex particle shapes. In this respect, the model granular media with spherical particles provide a reference material for understanding the rheology when the particle shapes deviate from a spherical or circular shape [11,12].

A wide variety of particle shapes can be found in nature and industry: elongated and platy shapes (e.g., in biomaterials and pharmaceutical applications), angular and facetted shapes (e.g., in geomaterials), and nonconvex shapes (e.g., in sintered powders). The behavior under various types of loading is strongly influenced by particle shape. Rounded particles enhance flowability whereas angular shape is susceptible to improve shear strength. In many applications, the particle shapes need to be optimized in order to increase performance [13-18]. These trends are generally explained in qualitative terms and linked with the jamming of the particles. In a sheared granular material, the local equilibrium structures are generically anisotropic in terms of contact directions and forces [5,29-35]. It was recently shown that the fabric anisotropy in a sheared granular assembly crucially depends on particle shape [11,12]. In the case of polygonal and polyhedral particles, due to large contact area of side-toside contacts, the fabric anisotropy appears to be marginal compared to force anisotropy [11,12]. Those contacts play a major role in force transmission by accommodating long force chains that are basically unstable in a packing composed of spheres.

The force and fabric anisotropies are at the origin of the enhanced shear strength of materials composed of nonspherical particles [12,25,33,36]. The particle shape affects the compactness and dilatancy of granular materials. A nontrivial effect, evidenced recently by experiments and numerical simulations for spheroids, is the finding that the solid fraction is not a monotonous function of the aspect ratio [20–23,37]. The solid fraction increases linearly to a maximum and then declines in inverse proportion to the aspect ratio [38]. In powder processing, the particle shape appears also to be an important parameter controlling the flowability, discharge rates, and compaction of powders [39,40].

In this paper, we use contact dynamics simulations to investigate the rheology of large packings of elongated particles with increasing aspect ratio. The particles are rectangles with rounded caps to which we will refer as rounded-

The effect of particle shape is mediated by the specific *granular texture* induced by each particle shape. For example, it is found that hard ellipses can be jammed even though they are underconstrained [19–24]. In general, the anisometric or elongated particle shapes, such as spheroids and spherocylinders, tend to develop orientational order affecting force transmission and frictional behavior [3,25–27]. This "nematic" ordering occurs while, in contrast to liquid crystals, the particles interact only via contact and friction [28].

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cap rectangular (RCR) particles. These particles may be considered as two-dimensional (2D) analog of spherocylinders. The RCR shape can be characterized by a single aspect ratio α or, as we shall see, by an elongation parameter η varying from 0 to 1 as the particle shape varies continuously from a circle to a thin line. We are interested both in the properties of the static packings of RCR particles prepared by isotropic compaction without friction and in the stress-strain behavior under biaxial compression with finite friction between particles.

The macroscopic behavior is studied in terms of the internal angle of friction and solid fraction for different values of η . We find a nonmonotonous variation of the solid fraction and a nearly linear increase of the internal angle of friction with η . In order to understand the origins of this behavior and the role of particle shape, we perform a detailed analysis of the microstructure and stress transmission. We consider the organization of the particles and contacts in the simulated packings, as well as the stress transmission by means of a harmonic representation of the stress tensor in terms of force and fabric anisotropies. The microstructure is increasingly dominated by a short-range nematic ordering of particle orientations as η increases. We show that the internal angle of friction is influenced by this ordering via an increasing anisotropy of friction forces and contact orientations with the elongation parameter. For all values of the latter, the harmonic approximation provides an excellent fit to the shear stress.

An important feature of RCR particles is that, like polygonal particles, they have lineal edges and can thus form sideto-side contacts as well as side-to-cap and cap-to-cap contacts. Hence, in a packing of RCR particles, the texture can characterized by the networks of these various contact types and the influence of the shape parameter on force transmission and shear strength may be analyzed in terms of these contacts and more specially the side-to-side contacts which are expected to play a stabilizing role in the packing.

In the following, we first present our numerical approach in Sec. II. Then, in Sec. III, the stress-strain behavior is presented for different values of η . The microstructure is analyzed in Sec. IV in terms of connectivity, orientations of the particles, and the contact network. We also present the harmonic approximation of the stress tensor allowing us to track the origins of the internal angle of friction via force and fabric anisotropies. In Sec. V, we present an additive decomposition of the connectivity, anisotropies, and forces as a function of different contact types. The force distributions are presented in Sec. VI. In Sec. VII, we analyze the structure of force networks with cap-to-cap, cap-to-side, and sideto-side contacts. We conclude with a summary and discussion of the most salient results of this work.

II. SYSTEM DESCRIPTION AND NUMERICAL PROCEDURES

In this section, we briefly introduce the contact dynamics (CD) method used for the simulations and the numerical procedures for sample preparation.

A. Contact dynamic method

The simulations were carried out by means of the CD method. This method is a "discrete element" approach for the simulation of granular dynamics with contact laws expressing mutual exclusion and Coulomb friction between particles without introducing elastic repulsion or viscous dissipation at the contact points [2,41–49]. The frictional contact interactions are described as *complementarity relations* between the relative velocities between particles and the corresponding momenta at the contact points. The condition of geometrical contact between two particles is expressed by the following mutually exclusive alternatives:

$$f_n \ge 0$$
 and $u_n = 0$,
 $f_n = 0$ and $u_n > 0$. (1)

where f_n is the normal contact force and u_n the relative normal velocity. u_n is counted positive when the particles move away from each other. In the same way, the Coulomb friction law involves the following three mutually exclusive conditions:

$$f_t = -\mu f_n \quad \text{and} \quad u_t > 0,$$

$$-\mu f_n \le f_t \le \mu f_n \quad \text{and} \quad u_t = 0,$$

$$f_t = \mu f_n \quad \text{and} \quad u_t < 0,$$
 (2)

where u_t is the sliding velocity at the contact, μ is the friction coefficient, and f_t is the friction force. Remark that none of the relations (1) and (2) can be reduced to a (mono)valued functional dependence between the two variables as assumed in the more common molecular dynamics (MD) method.

The CD method involves an efficient iterative algorithm based on a nonlinear Gauss-Seidel scheme for solving the equations of dynamics of the particles, satisfying at the same time the complementarity relations for contact forces and particle velocities at the end of each time step. The uniqueness of the solution is not *a priori* guaranteed for perfectly rigid particles. However, by initializing each step of calculation with the forces calculated in the preceding step, the evolution becomes deterministic. This has been confirmed by several comparisons to the MD method [2,48,50]. The CD method is particularly suitable for the simulation of rigid nearly undeformable particles. In this limit, the MD method requires steep interaction potentials and thus very small time steps making it numerically less efficient than the CD method.

B. Simulation of RCR particles

We model the RCR particle as a juxtaposition of two halfdisks of radius R' with one rectangle of length L and width 2R' (see Fig. 1). The shape of a RCR particle is a circle of radius R' for L=0. The aspect ratio $\alpha = (L+2R')/(2R')$ is 1 in this limit and increases with L for a fixed value of R'. In this paper, we use an alternative parameter describing the deviation of the particle shape from a circle. Let R be the radius of the circle circumscribing the particle. We have R



FIG. 1. Shape of a RCR.

=L/2+R'. The radius R' is also that of the inscribed circle. Hence, the deviation from a circular shape can be characterized by R-R'=L/2. We use the dimensionless parameter η defined by

$$\eta = \frac{R - R'}{R} = \frac{\alpha - 1}{\alpha}.$$
 (3)

It varies from $\eta=0$, for a circle, to 1 corresponding to a line. We will refer to η as the *elongation* parameter as in rock mechanics [51].

For the detection of the contacts between two RCR particles, we use the schema shown in Fig. 2. Three types of contact can be distinguished: cap-to-cap (cc), cap-to-side (cs) and side-to-side (ss). The contacts between the particles are thus detected separately for the pairs of circles and rectangles. In general, in the CD method, ss contact between two rectangles is treated as composed of two point contacts and the contact laws (1) and (2) are applied separately to each point. The choice of these points does not affect the resultant force and its point of application. Hence, for RCR particles, as shown in Fig. 2, ss contact is composed of four point contacts: two points due to the rectangle-rectangle interface and two points due to the cc contacts. Thus, four forces are calculated by the CD algorithm but only their resultant and application points are material.

The detection of line contacts between rectangles was implemented through the so-called *shadow overlap method* devised initially by Moreau [16,46] for polygons. The reliability and robustness of this method have been tested in several years of previous applications to granular materials [3,11,12,16,36,52,53]. This detection procedure is fairly rapid and allows us to simulate large samples composed of RCR particles. For our simulations, we used the LMGC90 which is a multipurpose software developed in Montpellier, capable of modeling a collection of deformable or undeform-



FIG. 2. (Color online) Representations of cap-to-cap, cap-toside, and side-to-side contacts and they will be referred as *cc* contacts, *cs* contacts, and *ss* contacts, respectively.



FIG. 3. Boundary conditions for (a) isotropic and (b) biaxial compactions.

able particles of various shapes (spherical, polyhedral, or polygonal) by means of the CD method [46].

C. Sample preparation

We prepared eight different packings of 13 000 RCR particles with η varying from 0 to 0.7 by steps of 0.1. The radius *R* of the circumscribing circle defines the size of a RCR particle. In order to avoid long-range ordering in the limit of small values of η , we introduce a size polydispersity by taking *R* in the range $[R_{\min}, R_{\max}]$, with $R_{\max} = 3R_{\min}$ with a uniform distribution in particle volume fractions.

All samples are prepared according to the same protocol. A dense packing composed of disks (η =0) is first constructed by means of a layer-by-layer deposition model based on simple geometrical rules [54–57]. The particles are deposited sequentially on a substrate. Each new particle is placed at the lowest possible position at the free surface as a function of its diameter. This procedure leads to a dense packing in which each particle is supported by two underlying particles and supports one or two other particles. For η > 0, the same packing is used with each disk serving as the circumscribing circle of a RCR particle. The RCR particle is inscribed with the given value of η and random orientation in the disk.

Following this geometrical process, the packing is compacted by isotropic compression inside a rectangular frame of dimensions $l_0 \times h_0$ in which the left and bottom walls are fixed and the right and top walls are subjected to the same compressive stress σ_0 [see Fig. 3(a)]. The gravity g and friction coefficients μ between particles and with the walls are set to zero during the compression in order to avoid force gradients and obtain isotropic dense packings. Figure 4 displays snapshots of the packings for several values of η at the end of isotropic compaction.

The isotropic samples are then subjected to vertical compression by downward displacement of the top wall at a constant velocity v_y for a constant confining stress σ_0 acting on the lateral walls [see Fig. 3(b)]. The friction coefficient μ between particles is set to 0.5 and to zero with the walls. The simulations were run with a time step of 2×10^{-4} s. The CPU time was 5×10^{-4} s per particle and per time step on an AMD processor. Since we are interested in quasistatic behavior, the shear rate should be such that the kinetic energy supplied by shearing is negligible compared to the static pressure. This can be formulated in terms of an *inertia parameter I* defined by [58]

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FIG. 4. Examples of the generated packings at the initial state.

$$I = \dot{\varepsilon} \sqrt{\frac{m}{p}},\tag{4}$$

where $\dot{\varepsilon} = \dot{y}/y$ is the strain rate, *m* is the particle mass, and *p* is the mean pressure. The quasistatic limit is characterized by the condition $I \leq 1$. In our simulations, *I* was below 10^{-3} .

III. STRENGTH AND DILATANCY

In this section, we consider the stress-strain and volumechange behaviors as a function of the shape parameter η . We need to evaluate the stress tensor and solid fraction during deformation from the simulation data. For the stress tensor, we start with the tensorial moment M^i of each particle *i* that is defined by [59,60]

$$M^{i}_{\alpha\beta} = \sum_{c \in i} f^{c}_{\alpha} r^{c}_{\beta}, \qquad (5)$$

where f_{α}^{c} is the α component of the force exerted on particle *i* at the contact *c*, r_{β}^{c} is the β component of the position vector of the same contact *c*, and the summation runs over all contact neighbors of particle *i* (noted briefly by $c \in i$). The average stress tensor $\boldsymbol{\sigma}$ in the volume *V* of the granular assembly is given by the sum of the tensorial moments of individual particles divided by the volume [59,60]

$$\boldsymbol{\sigma} = \frac{1}{V} \sum_{i \in V} \boldsymbol{M}^{i} = \frac{1}{V} \sum_{c \in V} f^{c}_{\alpha} \boldsymbol{\ell}^{c}_{\beta}, \tag{6}$$

where ℓ^c is the branch vector joining the centers of the two touching particles at the contact point *c*. Remark that the first summation runs over all particles whereas the second summation involves the contacts, each contact appearing only once.

Under biaxial conditions with vertical compression, we have $\sigma_1 \ge \sigma_2 = \sigma_0$, where the σ_{α} are the stress principal values. The mean stress *p* and stress deviator *q* are defined by

$$p = \frac{1}{2}(\sigma_1 + \sigma_2), \tag{7}$$



FIG. 5. (Color online) Normalized shear stress q/p as a function of cumulative shear strain ε_q for different values of the shape parameter η .

$$q = \frac{1}{2}(\sigma_1 - \sigma_2). \tag{8}$$

For our system of perfectly rigid particles, the stress state is characterized by the mean stress p and normalized shear stress q/p.

The strain parameters are the cumulative vertical, horizontal, and shear strains ε_1 , ε_2 , and ε_q , respectively. By definition, we have

$$\varepsilon_1 = \int_{h_0}^{h} \frac{dh'}{h'} = \ln\left(1 + \frac{\Delta h}{h_0}\right),\tag{9}$$

where h_0 is the initial height and $\Delta h = h_0 - h$ is the total downward displacement, and

$$\varepsilon_2 = \int_{l_0}^{l} \frac{dl'}{l'} = \ln\left(1 + \frac{\Delta l}{l_0}\right),\tag{10}$$

where l_0 is the initial box width and $\Delta l = l - l_0$ is the total change of the box width. The cumulative shear strain is then defined by

$$\varepsilon_q \equiv \varepsilon_1 - \varepsilon_2. \tag{11}$$

Finally, the cumulative volumetric strain ε_p is given by

$$\varepsilon_p = \varepsilon_1 + \varepsilon_2 = \int_{V_0}^{V} \frac{dV'}{V'} = \ln\left(1 + \frac{\Delta\phi}{\phi}\right), \quad (12)$$

where $V_0 = l_0 h_0$ is the initial volume and $\Delta \phi = \phi - \phi_0$ is the cumulative change of solid fraction.

Figure 5 shows the normalized shear stress q/p as a function of shear strain ε_q for different values of η . The jump observed at $\varepsilon_q=0$ reflects both the rigidity of the particles and high initial solid fraction of the samples (see below). In all cases, the shear stress passes by a peak before relaxing to a stress plateau corresponding to the so-called "residual state" in soil mechanics [61]. We remark that the residual shear stress increases with η .

The internal angle of friction φ^* , representing the shear strength of the material, is defined from the mean value $(q/p)^*$ of the normalized shear stress in the residual state by [61]



FIG. 6. (Color online) Internal angle of friction φ^* as a function of (a) aspect ratio α and (b) elongation η . Error bars represent the standard deviation in the residual state.

$$\sin \varphi^* = \left(\frac{q}{p}\right)^*.$$
 (13)

Figure 6 shows the variation of $\sin \varphi^*$ as a function of α and η . We see that the shear strength is an increasing nonlinear function of the aspect ratio, but, interestingly, it varies linearly when plotted versus the elongation parameter. Hence, we have

$$\sin \varphi^* = \sin \varphi_0^* + k \eta = \sin \varphi_0^* + k \left(1 - \frac{1}{\alpha} \right).$$
 (14)

This observation indicates that η is a "good" parameter for shape elongation and will be used in the following for this reason.

Figure 7(a) displays the cumulative volumetric strain ε_p as a function of ε_q for different values of η . Starting with an initially dense state, all packings dilate and hence the volume increases. For $\eta \leq 0.4$, a plateau is reached beyond $\varepsilon_q = 0.3$, corresponding to a state of isochoric deformation. For larger aspect ratios, the dilatation continues even at very large deformations. This is an indication of an inhomogeneous dilation due to the formation of shear bands in the bulk, which is enhanced by the elongated shape of the particles. Since different parts of the packing undergo differential volume change, longer shearing is required to reach a fully dilated state for the whole packing. The initiation and evolution of shear bands for different particle elongations will be reported in more detail elsewhere.

Figure 7(b) displays the solid fraction ν as a function of η at different levels of shear deformation ε_q . It is remarkable that, at all levels of deformation, the solid fraction increases with η , reaches a maximum at $\eta \approx 0.4$, and then declines as





FIG. 7. (Color online) (a) Cumulative volumetric strain ε_p as a function of shear strain ε_q . (b) Solid fraction as a function of particle shape parameter η at different levels of shear strain.

 η further increases. We note that solid fractions as large as 0.90 are reached for $\eta=0.4$ in the initial state. A similar nonmonotonous behavior was observed for packings of ellipses or ellipsoidal particles [20,21,23]. This is somewhat a counterintuitive finding as the shear strength (a monotonous function of η) does not follow the trend of solid fraction (nonmonotonous). This behavior is clearly not related to shear localization since it is observed at all levels of deformation including the initial isotropic state $\phi_0 = \phi(\varepsilon_q = 0)$ where the packings are homogeneous.

A rapid falloff of solid fraction for elongated particles in three dimensions (3D) was observed at very large aspect ratios and attributed to the excluded volume due to disorder, predicting a falloff in inverse proportion to the aspect ratio [38,62,63]. The initial rapid increase of solid fraction, as observed in Fig. 7, reveals that excluded-volume effects are not the prevailing mechanism at low aspect ratios. In this limit, slight deviations from spherical shape have strong spacefilling effect on the packing although the excluded volume increases at the same time and becomes dominant at very large aspect ratios.

The volumetric deformation can also be expressed in terms of the *dilatancy angle* ψ defined by [64]

$$\sin \psi = \frac{\partial \varepsilon_p}{\partial \varepsilon_q}.$$
 (15)

The plot of ψ as a function of φ , the so-called "stressdilatancy diagram," is shown in Fig. 8 for different values of η . We observe a linear correlation between φ and ψ irrespective of the value of η . We have



FIG. 8. (Color online) Dilatancy angle ψ vs internal angle of friction φ for different values of η .

$$\varphi \simeq \varphi^* + \psi. \tag{16}$$

This is a particularly simple relation compared to several models proposed in soil mechanics [64,65]. It reflects the "nonassociated" character of granular plasticity, an associated behavior implying simply $\varphi = \psi$, which is unrealistic for granular materials [64,66–68]. According to relation (16), the dilatancy angle vanishes in the residual state where $\varphi = \varphi^*$. Recent work on cohesive and granular packings of polygonal particles in 2D is in agreement with this correlation [36,69]. In the following, we focus on the microstructure and force transmission that provide a key to a better understanding of the physical mechanisms underlying the effect of particle shape on the shear strength.

IV. GRANULAR TEXTURES

In this section, we investigate the general organization (texture) of our packings of RCR particles in terms of particle orientations and contact network. This will allow us to quantify the effect of the elongation parameter and its connection with shear strength.

A. Particle orientations

The principal feature of elongated particles is their orientational degree of freedom. The particle orientation is represented by a unit vector \boldsymbol{m} as shown in the inset to Fig. 10. In 2D, it is parametrized by a single angle ϑ . Let $\mathcal{D}(\vartheta)$ be the set of particles with direction $\vartheta \in [\vartheta - \delta \vartheta/2; \vartheta + \delta \vartheta/2]$ for angle increments $\delta \vartheta$ and $N_p(\vartheta)$ its cardinal. The probability $P_{\vartheta}(\vartheta)$ of the orientations of particles is given by

$$P_{\vartheta}(\vartheta) = \frac{N_p(\vartheta)}{N_p},\tag{17}$$

where N_p is the total number of particles.

Figure 9 displays a polar representation of $P_{\vartheta}(\vartheta)$ for η =0.7 at various stages of deformation. In the initial state, corresponding to an isotropic stress state, the distribution is anisotropic with privileged direction ϑ_p close to $\pi/2$. This means that for elongated particles, the particle orientations are not fully correlated with the stress state so that the resulting particle orientation anisotropy depends on details of the assembling process that cannot be controlled by simply subjecting the particles to isotropic stresses from the boundary.



FIG. 9. Polar representation of the probability density P_{ϑ} of particle orientations ϑ for η =0.7 at various stages of deformation ε_q . The symbols are the simulation data. Solid lines represent harmonic fit according to Eq. (18).

The privileged direction rotates as a result of vertical compression and becomes horizontal (parallel to the minor principal stress direction) in the residual state. The distributions are nicely fitted by harmonic approximation corresponding to the lowest-order terms of the Fourier expansion of $P_{\vartheta}(\vartheta)$ [70,71]

$$P_{\vartheta}(\vartheta) = \frac{1}{2\pi} \{ 1 + a_p \cos 2(\vartheta - \theta_{\sigma}) \}, \tag{18}$$

where a_p represents the anisotropy of the distribution and θ_{σ} is the major principal stress direction. The choice of θ_{σ} as reference direction is motivated by the observation that the privileged orientation of the particles tends to align itself with the minor principal stress direction. Hence, negative values of a_p mean that the particles are preferentially oriented perpendicular to the major principal stress.

We plot the particle orientation anisotropy a_p in Fig. 10 as a function of η at different stages of shear ε_q . We see that the particle orientations are isotropic for $\eta \leq 0.4$ at the initial state and they become increasingly anisotropic as η increases beyond 0.4. At nearly all stages of shear, a_p is negative, and at most advanced stage, i.e., corresponding approximately to



FIG. 10. Particle orientation anisotropy a_p as a function of shape parameter η at different stages of shear ε_q .



FIG. 11. (Color online) Color level map of particle orientations for η =0.2 (up) and η =0.7 (down) in the residual state.

the residual state, it becomes nearly independent of η . The large absolute value of a_p (~0.35) suggests that many particles are aligned in horizontal layers just as in nematic order. One example of this nematic ordering is shown in Fig. 11 for two different values of η . This ordering may be attributed to the favored mechanical equilibrium of the particles under the action of vertical stress and enhanced by boundary alignment of the elongated particles [3,26,27,72]. This point will be analyzed more deeply below.

B. Particle connectivity

The primary statistical quantity describing the contact network is the coordination number z (average number of contacts per particle). For our elongated particles, each side-toside contact is counted as one contact even if side-to-side contacts are treated as four point contacts belonging to the contact segment (see Sec. II). The floating particles with no force-bearing contact (i.e., with less than two active contacts) are thus removed from the statistics. The fraction of floating particles decreases linearly with η from 17% for η =0 to 10% for η =0.7.

Figure 12 displays the evolution of z as a function of η in the initial and residual states. The initial-state value z=4 corresponds to a frictionless packing of circular particles in the isostatic state with z=2d, where d is space dimension (indeed, the packings where prepared by setting the friction coefficient to zero). However, as η increases, z increases to a plateau value of ~5.6. This is in agreement with recent work showing that large disordered jammed packings are isostatic only for disks or spheres [19–24,73]. For nonspherical or noncircular particles, we have $z \le d(d+1)$.



FIG. 12. (Color online) Initial and residual coordination numbers as a function of shape parameter η . Error bars represent the standard deviation in the residual state.

Numerical results for frictional or frictionless systems of rigid or deformable disks and spheres [19,74–77], as well as with ellipses and spheroids [20–24,78], confirm this point. In the residual state, the mean value of z is below that in the isotropic state and it grows from 3 to 5 with η . It is interesting to note that z does not follow the solid fraction which, as we have seen before, is nonmonotonous as a function of η . This means that for large aspect ratios, the packings are loose but well connected.

The connectivity of the contact network can be characterized in more details by the fraction P(c) of particles with exactly *c* contact neighbors. Figure 13 shows P(c) in the residual state for different values of η . The distribution is increasingly broader as η becomes larger. The particles can have as many as ten contact neighbors at $\eta=0.7$. This is allowed both by the geometry and polydispersity of the particles as shown by a typical gray-level map of particle connectivities in Fig. 14. For $\eta=0$, we observe a peak at c=3. This peak slides gradually to c=5 at $\eta=0.7$ as observed also for *z*, which is, by definition, the mean value of *c* for forcebearing contacts: $z=\langle c \rangle = \sum_{c=2}^{\infty} cP(c)$.

C. Force and texture anisotropies

Equation (6) shows that the expression of stress tensor is an arithmetic mean involving the branch vectors ℓ and contact force vectors f. This means that for the analysis of stress transmission and shear strength from a particle-scale view-



FIG. 13. (Color online) Connectivity diagram for each samples expressing the fraction P(c) of particles with exactly c contacts in the residual state. Note that the floating particles (i.e., with more than one active) are removed from the statistics

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FIG. 14. (Color online) Color map of particle connectivities. Color intensity is proportional to coordination number.

point, we need a statistical description of these quantities.

A common approach used by various authors is to express branch vectors and contact force orientations in terms of the contact direction, i.e., in the local *contact frame* (n, t), where *n* is the unit vector perpendicular to the contact plane and *t* is an orthonormal unit vector oriented along the tangential force [4,5,25,29–31,33,36,79–81] [see Fig. 15(a)]. The components of the branch vector and contact force are expressed in this frame as

$$\begin{cases} \ell = \ell_n n + \ell_t t \\ f = f_n n + f_t t, \end{cases}$$
(19)

where ℓ_n and ℓ_t are the normal and tangential components of the branch vectors and f_n and f_t the normal and tangential components of the contact force.

Remark that only for disks or spherical particles, we have $\ell = \ell n$, where ℓ is the length of the branch vector. A consequence of noncircular or nonspherical particle shape is to dissociate the contact frame from the *branch vector frame* (n', t'), where n' is the unit vector along the branch ℓ and t' is the orthoradial unit vector [10,12] [see Fig. 15(b)]. We express the components of the branch vector and contact force also in this frame

$$\begin{cases} \ell = \ell_{n'} \boldsymbol{n}' \\ \boldsymbol{f} = f_{n'} \boldsymbol{n}' + f_{t'} \boldsymbol{t}', \end{cases}$$
(20)

where $f_{n'}$ and $f_{t'}$ are the *radial* and *orthoradial* components of the contact force and $\ell_{n'} = \ell$.

In two dimensions, let θ and θ' be the orientations of n and n', respectively. From the numerical data, we can evaluate the probability density functions $P_{\theta}(\theta)$ and $P_{\theta'}(\theta')$ of



FIG. 15. (Color online) (a) Contact frame (n, t) and (b) intercenter frame (n', t').



FIG. 16. (Color online) Contact anisotropy a_c (black circle) and branch vector anisotropy a'_c (red/gray square) as a function of shape parameter η averaged in residual state. Error bars represent the standard deviation in the residual state. Inset shows the angular probability densities $P_{\theta}(\theta)$ in black circle and $P_{\theta'}(\theta')$ in red/gray square for η =0.7 calculated from the simulation data (points) together with the harmonic approximation (lines).

contact and branch vector orientations, respectively, as well as the angular averages of the force components $\langle f_n \rangle(\theta)$, $\langle f_t \rangle(\theta), \langle f_{n'} \rangle(\theta')$, and $\langle f_{t'} \rangle(\theta')$ and branch vector components $\langle \ell_n \rangle(\theta), \langle \ell_t \rangle(\theta)$, and $\langle \ell_{n'} \rangle(\theta')$. In the absence of an intrinsic polarity for **n** and **n'**, all these functions are π -periodic. The insets to Figs. 16–18 display polar representations of these functions for η =0.7 at the end of shearing. All these angular functions are generically anisotropic. The peak values occur along the axis of compression ($\theta = \pi/2$) for P_{θ} , $P_{\theta'}$, $\langle f_n \rangle$, and $\langle f_{n'} \rangle$ and along the axis of extension (θ =0) for $\langle \ell_n \rangle$ and $\langle \ell_{n'} \rangle$. The maxima for the tangential components occur in the direction of $\pi/4$ with respect to the axis of compression.

The simple shapes of the above functions suggest that they can be approximated by their Fourier expansions up to the second term [12,25,31,33,82]



FIG. 17. (Color online) Normal and tangential branch length anisotropies a_{ln} (circle) and a_{lt} (square) and branch length anisotropy $a_{ln'}$ (triangle) as a function of shape parameter η in the residual state. Error bars represent the standard deviation in the residual state. Inset shows the angular average functions $\langle \ell_{ln} \rangle(\theta)$, $\langle \ell_{lt} \rangle(\theta)$, and $\langle \ell_{ln'} \rangle(\theta)$ in black (circle), red (dark gray square), and green (light gray triangle), respectively, for η =0.7 calculated from the simulation data (points) and approximated by harmonic fits (lines).

$$P_{\Theta}(\Theta) = \frac{1}{2\pi} \{ 1 + a_c^* \cos 2(\Theta - \Theta_c^*) \}$$

$$\langle \ell_{n^*} \rangle (\Theta) = \langle \ell \rangle \{ 1 + a_{ln^*} \cos 2(\Theta - \Theta_{ln^*}) \}$$

$$\langle \ell_{t^*} \rangle (\Theta) = \langle \ell \rangle a_{lt^*} \sin 2(\Theta - \Theta_{lt^*})$$

$$\langle f_{n^*} \rangle (\Theta) = \langle f \rangle \{ 1 + a_{fn^*} \cos 2(\Theta - \Theta_{fn^*}) \}$$

$$\langle f_{t^*} \rangle (\Theta) = \langle f \rangle a_{ft^*} \sin 2(\Theta - \Theta_{ft^*}),$$
(21)

where Θ stands either for θ or for θ' depending on the local frame used. The $\langle \ell \rangle$ is mean length of branch vectors and $\langle f \rangle$ the mean force. is $(a_c^*, a_{ln^*}, a_{lt^*}, a_{fn^*}, a_{ft^*})$ $(\Theta_c^*, \Theta_{ln^*}, \Theta_{lt^*}, \Theta_{fn^*}, \Theta_{ft^*})$ $=(a_c,a_{ln},a_{lt},a_{fn},a_{ft})$ and $=(\theta_c, \theta_{ln}, \theta_{lt}, \theta_{fn}, \theta_{ft})$ are the anisotropy parameters and the angle of privileged direction of each function in the frame (\mathbf{n}, \mathbf{t}) . In the same way, we have $(a_c^*, a_{ln^*}, a_{lt^*}, a_{fn^*}, a_{ft^*})$ $(\Theta_c^*, \Theta_{ln^*}, \Theta_{lt^*}, \Theta_{fn^*}, \Theta_{ft^*})$ $=(a'_{c}, a_{ln'}, a_{lt'}, a_{fn'}, a_{ft'})$ and = $(\theta_c', \theta_{ln'}, \theta_{lt'}, \theta_{fn'}, \theta_{ft'})$ in the frame $(\mathbf{n}', \mathbf{t}')$.

Note that, by construction, we have $a_{lt'}=0$ and $\theta_{lt'}=0$. In the following, we will refer to a_c as contact anisotropy, to a'_c as branch vector orientation anisotropy, to (a_{ln^*}, a_{lt^*}) as branch length anisotropies, and to (a_{fn^*}, a_{ft^*}) as normal and tangential or radial and orthoradial force anisotropies depending on the local frame [9,36]. These harmonic approximations are well fit to our data as shown in the insets to Figs. 16–18.

In practice, it is convenient to estimate the above anisotropies from the following *fabric and force tensors* [32]:

$$\begin{cases} F_{\alpha\beta}^{*} = \frac{1}{\pi} \int_{0}^{\pi} n_{\alpha}^{*} n_{\beta}^{*} P_{\Theta}(\Theta) d\Theta \\ \chi_{\alpha\beta}^{ln^{*}} = \frac{1}{\langle \ell \rangle} \int_{0}^{\pi} \langle \ell_{n^{*}} \rangle(\Theta) n_{\alpha}^{*} n_{\beta}^{*} P_{\Theta}(\Theta) d\Theta \\ \chi_{\alpha\beta}^{ln^{*}} = \frac{1}{\langle \ell \rangle} \int_{0}^{\pi} \langle \ell_{l^{*}} \rangle(\Theta) n_{\alpha}^{*} t_{\beta}^{*} P_{\Theta}(\Theta) d\Theta \\ \chi_{\alpha\beta}^{fn^{*}} = \frac{1}{\langle f \rangle} \int_{0}^{\pi} \langle f_{n^{*}} \rangle(\Theta) n_{\alpha}^{*} n_{\beta}^{*} P_{\Theta}(\Theta) d\Theta \\ \chi_{\alpha\beta}^{fn^{*}} = \frac{1}{\langle f \rangle} \int_{0}^{\pi} \langle f_{l^{*}} \rangle(\Theta) n_{\alpha}^{*} t_{\beta}^{*} P_{\Theta}(\Theta) d\Theta, \end{cases}$$
(22)

where α and β design the components in the considered frame. Note that, by construction, we have $\chi_{\alpha\beta}^{lt'}=0$. From Eqs. (21) and (22), assuming that in a sheared state $\Theta_c^* = \Theta_{ft^*} = \Theta_{\sigma}, \Theta_{ln^*} = \Theta_{lt^*} = 0$ or θ_{σ} , the following relations are easily obtained:

$$a_{c}^{*} = 2(F_{1}^{*} - F_{2}^{*})/(F_{1}^{*} + F_{2}^{*}),$$

$$a_{ln^{*}} = 2(\chi_{1}^{ln^{*}} - \chi_{2}^{ln^{*}})/(\chi_{1}^{ln^{*}} + \chi_{2}^{ln^{*}}) - a_{c}^{*}$$

$$a_{lt^{*}} = 2(\chi_{1}^{l^{*}} - \chi_{2}^{l^{*}})/(\chi_{1}^{l^{*}} + \chi_{2}^{l^{*}}) - a_{c}^{*} - a_{ln^{*}}$$

$$a_{fn^{*}} = 2(\chi_{1}^{fn^{*}} - \chi_{2}^{fn^{*}})/(\chi_{1}^{fn^{*}} + \chi_{2}^{fn^{*}}) - a_{c}^{*}$$

$$a_{ft^{*}} = 2(\chi_{1}^{f^{*}} - \chi_{2}^{f^{*}})/(\chi_{1}^{f^{*}} + \chi_{2}^{f^{*}}) - a_{c}^{*} - a_{fn^{*}},$$
(23)

where $\chi^{l^*} = \chi^{ln^*} + \chi^{lt^*}$, $\chi^{f^*} = \chi^{fn^*} + \chi^{ft^*}$, and the indices 1 and 2 refer to the principal values of each tensor. By construction,



FIG. 18. (Color online) Normal and tangential force anisotropies a_n (black circle, plain line) and a_t (black circle, dashed line) and radial and orthoradial force anisotropies a'_n (red/gray square, plain line) and a'_t (red/gray square, dashed line) as a function of η in the residual state. Error bars represent the standard deviation in the residual state. Inset shows the angular average functions (a) $\langle f_n \rangle (\theta)$ and $\langle f_{t'} \rangle (\theta)$ in black and green, respectively, and (b) $\langle f_t \rangle (\theta)$ and $\langle f_{t'} \rangle (\theta)$ in red and blue, respectively, for $\eta=0.7$ calculated from the simulation data (points) together with the harmonic approximation (lines). Error bars represent the standard deviation in the residual state.

we have $(F_1^*+F_2^*)=1$, $(\chi_1^{l^*}+\chi_2^{l^*})=\langle \ell \rangle$, and $(\chi_1^{f^*}+\chi_2^{f^*})=\langle f \rangle$. Note that a_c^* , a_{fn^*} , and a_{ft^*} are always positive whereas a_{ln^*} and a_{lt^*} are negative. We have $\Theta_{ln^*}=0$ and $\Theta_{lt^*}=0$.

Figure 16 displays the variation of contact anisotropy a_c and branch vector orientation anisotropy a'_c , both averaged in the residual state, as a function of η . We observe two distinct behaviors: a_c increases quickly from 0.3 to 0.7 with η whereas, after a slight increase, a'_c declines to nearly 0 for $\eta=0.7$. It is often admitted that the shear strength in granular media is a consequence of the buildup of an anisotropic geometrical structure due to friction and steric exclusions between particles [4,5,79,82–84]. But here we have two different structural anisotropies a_c and a'_c that vary in opposite directions as η is increases. Hence, when the granular structure is complex as in our packings of nonspherical particle shapes, the choice of the statistical representation of the granular structure has to be specified [12,36]. This point will be addressed in more detail in Sec. VII.

The branch vector length anisotropies a_{ln} , a_{lt} , and $a_{ln'}$, averaged in the residual state, are plotted in Fig. 17 as a function of η . These parameters are negligibly small at small values of η , i.e., for nearly circular particles, and decline to negative values as η is increased. This means that the particles tend to form longer branch vectors with their neighbors in the direction of extension, suggesting that the particles touch preferentially along their minor axes when the contact orientation is close to the compression axis and along their major axis when the contact orientation is close to the extension axis (see Sec. VII). It is also remarkable that $a_{ln} \approx a_{ln'}$, whereas $|a_{ln}| < |a_{lt}|$ particularly for $\eta \ge 0.4$.

The normal and tangential force anisotropies a_{fn} and a_{ft} are plotted in Fig. 18 as a function of η , together with the radial and orthoradial force anisotropies $a_{fn'}$ and $a_{ft'}$, averaged in the residual state. In contrast to contact anisotropy, we see that a_{fn} and $a_{fn'}$ grow together slowly until η =0.4, then a_{fn} remains nearly constant whereas $a_{fn'}$ increases. On

the other hand, the anisotropy $a_{ft'}$ of orthoradial forces grows much faster with η than the anisotropy a_{ft} of tangential forces. Remarkably, from $\eta > 0.4$, the orthoradial force anisotropy is higher than radial force anisotropy $(a_{ft'} > a_{fn'})$ whereas, even if the tangential force anisotropy increases with η , it is still below the normal force anisotropy $(a_{ft} < a_{fn})$ and remains always below the contact anisotropy $(a_{fn} < a_c)$. In other words, the force anisotropy described in terms of branch vectors reflects more sensitively the effect of particle shape elongation than in terms of contact normal vectors. We will see below that this behavior is related to the mobilization of friction (Sec. V) and contact types (Sec. VII).

V. GEOMETRICAL AND MECHANICAL ORIGINS OF SHEAR STRENGTH

The stress tensor as formulated in Eq. (6) is a function of discrete microscopic parameters attached to the contact network. For sufficiently large systems, the dependence of volume averages on individual discrete parameters vanishes [25,31,85] and the discrete sums can be replaced by integrals. According to Eq. (6), we have

$$V\sigma_{\alpha\beta} = \sum_{c \in i} f^c_{\alpha} r^c_{\beta} = N_c \langle f_{\alpha} \ell_{\beta} \rangle, \qquad (24)$$

where N_c is the total number of contacts. By writing the average on the right-hand side in integral form, we get

$$\sigma_{\alpha\beta} = n_c \int_{\Omega} f_{\alpha} \ell_{\beta} P_{\ell f} df d\ell , \qquad (25)$$

where $P_{\ell f}$ is the joint probability density of forces and branch vectors, n_c is the number density of contacts, and Ω is the integration domain in the space (ℓ, f) .

The integral appearing in Eq. (25) can be reduced by integrating first with respect to the forces and branch vector lengths. Considering the components of the forces and branch vectors in one of the two local frames (n,t) or (n',t') and neglecting the branch vector-force correlations, we get [9,12,31,35]

$$\sigma_{\alpha\beta} = n_c \int_0^{\pi} \{ \langle \ell_{n^*} \rangle(\Theta) n_{\alpha}^*(\Theta) + \langle \ell_{t^*} \rangle(\Theta) t_{\beta}^*(\Theta) \}, \\ \{ \langle f_{n^*} \rangle(\Theta) n_{\alpha}^*(\Theta) + \langle f_{t^*} \rangle(\Theta) t_{\beta}^*(\Theta) \} P(\Theta) d\Theta.$$
(26)

The expression of the stress tensor by Eq. (26) makes appear explicitly the average angular functions representing the fabric and force states. Using the harmonic approximation (21), Eq. (26) can be integrated with respect to space direction Θ and the stress invariants p and q extracted. Assuming that the stress tensor is coaxial with the fabric and force tensors (22) and neglecting cross products between anisotropies, we get the following simple relations:

$$\frac{q}{p} \approx \begin{cases} \frac{1}{2}(a_c + a_{ln} + a_{lt} + a_{fn} + a_{ft}) & \text{in } (\boldsymbol{n}, \boldsymbol{t}) \\ \frac{1}{2}(a_c' + a_{ln'} + a_{fn'} + a_{ft'}) & \text{in } (\boldsymbol{n'}, \boldsymbol{t'}). \end{cases}$$
(27)

The assumption of coaxiality is natural since, even if the preferential orientations of the forces and branch vectors are



FIG. 19. (Color online) Normalized shear stress $(q/p)^*$ in the residual state as a function of η together with two analytical expressions given by Eq. (27). Error bars represent the standard deviation in the residual state.

not fully correlated, we observe that shearing tends to align the contacts and forces with the principal directions of the stress tensor.

Figure 19 displays the residual-state value of the normalized shear stress $(q/p)^*$ as a function of η calculated both directly from the simulation data and from Eq. (27) separately for the two local frames by using the values of various anisotropies estimated from the simulation data. As we see, for both local frames, Eq. (27) provides an excellent fit to the data for all values of η . Note, however, that the second expression in Eq. (27) is simpler than the first expression (four anisotropic parameters vs five anisotropic parameters) and the resulting fit appears to be more accurate.

The excellent fits to the data by Eq. (27) indicate that the assumption of weak correlations between forces and branch vector lengths in the derivation of this equation is indeed a good approximation. This can be checked directly from the simulation data by evaluating the Pearson correlation parameter *C* defined by

$$C_{\ell f} = \frac{\langle \ell f \rangle}{\sqrt{\langle \ell^2 \rangle} \sqrt{\langle f^2 \rangle}},\tag{28}$$

where f is the magnitude of contact force. We find that $|C_{\ell f}|$ does not exceed 0.2 and that the largest correlations occur for most elongated particles [86].

The two equations (27) are interesting as they reveal distinct origins of shear strength in terms of force and texture anisotropies with two different decompositions. Various anisotropies do not contribute equally to the shear strength. The dominant anisotropies are texture anisotropies for projection on contact frame since $a_c + a_{ln} + a_{lt} > a'_c + a_{ln'}$ and force anisotropies for projection on the branch vector frame since $a_{fn'} + a_{ft'} > a_{fn} + a_{ft}$. The fact that the texture anisotropy prevails in the contact frame may be attributed to its strong correlation with particle orientations. Geometrically, for a particle oriented along a direction ϑ , more contacts can be formed with the flat side of the particle with normals oriented along $\vartheta + \pi/2$ than with its rounded caps. This is consistent with the observation that the particle orientations are strongly anisotropic with an anisotropy a_p of negative sign (preferred direction along the extension axis) and the contact



FIG. 20. (Color online) Map of radial forces for η =0.2 (up) and η =0.7 (down). Line thickness is proportional to the radial force. We represent the strong network in black and the weak network in red lines (gray) (see Sec. VI). The floating particles excluded from the force network are in white.

normal anisotropy a_c is positive (along the compression axis) and increases with aspect ratio (see Sec. IV).

In Fig. 20, two maps of radial forces are shown for packings with η =0.2 and η =0.7, respectively. In the presence of long parallel sides, the strong force chains are more tortuous. Hence, the stability of such structures requires strong activation of tangential forces. Indeed, we remark that the orthoradial force anisotropy is above the radial force anisotropy $(a_{ft'} > a_{fn'})$ for the most elongated particles in contrast to the tangential force anisotropy which is below the normal force anisotropy $(a_{ft} < a_{fn})$. As a result of the increasing activation of tangential forces, the fraction of sliding contacts (i.e., contacts where $|f_t| = \mu |f_n|$) grows with η as shown in Fig. 21. The contributions of side-to-side and cap-to-side contacts to force anisotropy and friction mobilization, which are major effects of particle shape, will be analyzed in Sec. VII.



FIG. 21. Proportion of sliding contacts as a function of η averaged in the residual state. Error bars represent the standard deviation in the residual state.



FIG. 22. (Color online) Probability distribution function of radial forces $f_{n'}$ normalized by the average radial force $\langle f_{n'} \rangle$ in loglinear (up) and log-log (down) plots for different values of η .

VI. FORCE DISTRIBUTIONS

The force chains and spatially inhomogeneous stress distributions are well-known features of granular media. A wellknown observation is that a large number of contacts transmit very weak forces, a signature of the arching effect, whereas a smaller fraction of contacts carry strong force chains [32]. Force transmission has been investigated by experiments and numerical simulations for disks, ellipses, and polygonal particles in 2D as for spherical, cylindrical, and polyhedral particles in 3D [12,26,36,87–95]. In close correlation with shear strength and solid fraction, the stress transmission is strongly influenced by particle shape. In particular, one expects that elongated particle shapes will influence mainly the distribution of weak forces by enhancing the arching effect.

The probability density function (pdf) of radial forces normalized by the mean radial force $\langle f_{n'} \rangle$ is shown in Fig. 22 in log-linear and log-log scales at large strains (the data are cumulated from several snapshots in the residual state) for all values of η . As usually observed, in all packings, the number of forces above the mean $\langle f_{n'} \rangle$ falls off exponentially whereas the number of forces below the mean vary as a power law

$$P(f_{n'}) \propto \begin{cases} e^{-\alpha_{n'}(\eta)(1-f_{n'}/\langle f_{n'}\rangle)}, & f_{n'} > \langle f_{n'}\rangle \\ \left(\frac{f_{n'}}{\langle f_{n'}\rangle}\right)^{\beta_{n'}(\eta)}, & f_{n'} < \langle f_{n'}\rangle, \end{cases}$$
(29)

where $\alpha_{n'}(\eta)$ and $\beta_{n'}(\eta)$ are the exponents which decrease with η from $\alpha^{n'}(0) \approx 1.69$ to $\alpha^{n'}(0.7) \approx 0.88$ and from $\beta^{n'}(0) \approx 0.13$ to $\beta^{n'}(0.7) \approx -0.49$. Figure 23 shows the pdf



FIG. 23. (Color online) Probability distribution function of orthoradial forces $f_{t'}$ normalized by the average orthoradial force $\langle |f_{t'}| \rangle$ in log-log for all values of η .

 $P(f_{t'})$ of orthoradial forces normalized by the mean orthoradial force $\langle f_{t'} \rangle$ in each packing. These distributions are also characterized by an exponential falloff for the forces above the average force $\langle f_{t'} \rangle$ and a power law for the forces below $\langle f_{t'} \rangle$,

$$P(f_{t'}) \propto \begin{cases} e^{-\alpha_{t'}(\eta)(1-|f_{t'}|\langle |f_{t'}| \rangle)}, & |f_{t'}| > \langle |f_{t'}| \rangle \\ \left(\frac{|f_{t'}|}{\langle |f_{t'}| \rangle}\right)^{\beta_{t'}(\eta)}, & |f_{t'}| < \langle |f_{t'}| \rangle, \end{cases}$$
(30)

with the corresponding exponents $\alpha_{t'}(\eta)$ and $\beta_{t'}(\eta)$, which decrease from $\alpha^{t'}(0) \approx 1.09$ to $\alpha^{t'}(0.7) \approx 0.73$ and from $\beta^{t'}(0) \approx -0.37$ to $\beta^{t'}(0.7) \approx -0.73$.

These distributions show clearly the larger inhomogeneity of stress transmission in a granular packing composed of elongated particles. We find that (the results not shown here), as with circular particles, the contacts can be classified into strong and weak networks. Evaluating q/p separately for each network, it is found that the shear stress is almost to-tally sustained by the strong contact network.

Maps of strong and weak radial networks for radial forces are displayed in Fig. 20 for η =0.2 and η =0.7. The fraction of floating particles (less than two contacts) decreases linearly with η from 17% for η =0 to 10% for η =0.7. Hence, more particles are involved in the contact network for more elongated particles, but it is remarkable that the proportion of weak forces grows from 60% for η =0 to 70% for η =0.7. In other words, although the number of strong contacts decreases with η , stronger force chains occur with more elongated particles. Although we focused here on the networks of



FIG. 24. (Color online) Proportions of side-to-side (*ss*), cap-toside (*cs*), and cap-to-cap (*cc*) contacts as a function of η in the residual state. Error bars represent the standard deviation in the residual state.

radial force components, we basically obtain the same conclusions for the normal force components.

We also remark that the packings are increasingly more inhomogeneous in the sense that as particle elongation increases, the packing involves less strong force chains in number but with stronger forces. This decreasing force homogeneity in spite of increasing connectivity (Fig. 12) means that force distributions are controlled by more subtle details of the microstructure than the density of contacts or solid fraction. As we shall see below, this is related to the role of various contact types in the contact network.

VII. EFFECT OF CONTACT TYPES

Remembering that RCR particles are clumps of two disks with one rectangle, in this section we revisit the results of the previous sections in the light of the organization of *cc*, *cs*, and *ss* contacts in each packing. The side-to-side or side-tocap contacts do not transmit torques, but they are able to accommodate force lines that are usually unsustainable by cap-to-cap contacts. For this reason, it is worthwhile trying to isolate their respective roles with respect to the shear strength. The proportions of these contact types and their contributions to the structural anisotropy and force transmission are key quantities for understanding the effect of particle shape on the shear strength properties of granular media [12,36].

In the residual state, the proportions of different contact types are nearly constant. Figure 24 shows the proportions k_{cc} , k_{cs} , and k_{ss} of cc, cs, and ss contacts averaged over the residual state as a function of η . We see that k_{cc} declines with η from 1 (for disks) to 0.2 for η =0.7. At the same time, k_{cs} and k_{ss} increase from 0 to 0.6 and to 0.2, respectively. Interestingly, $k_{cs} \approx k_{cc}$ for $\eta \approx 0.4$ and $k_{ss} \approx k_{cs}$ for η =0.7. In this way, as the particle elongation increases, the packing passes from a contact network dominated by cc contacts cs and ss.

To identify the impact of each contact type on the shear strength, we proceed by additive decomposition of the stress tensor by considering the expression (25) of the stress tensor and grouping the contacts according their types

$$\boldsymbol{\sigma} = \boldsymbol{\sigma}_{cc} + \boldsymbol{\sigma}_{cs} + \boldsymbol{\sigma}_{ss}, \qquad (31)$$

where σ_{cc} , σ_{cs} , and σ_{ss} are obtained from the expression of the stress tensor Eq. (25) by restricting the summation to cc,



FIG. 25. (Color online) Shear strength $(q/p)^*$ (circle) for *cs* (square), *ss* (triangle up), and *cc* (triangle down) contacts as a function of η , together with the harmonic approximation fits in (n,t) frame (—) and (n',t') frame (…).

cs, and *ss* contacts, respectively. The corresponding stress deviators q_{cc} , q_{cs} , and q_{ss} are then calculated and normalized by the mean pressure *p*. Figure 25 shows q_{cc}/p , q_{cs}/p , and q_{ss}/p averaged in the residual state as a function of η . We see clearly that q_{cc}/p follows a trend opposite to that of q_{cs}/p . For $\eta < 0.3$, $(q/p)^*$ is dominated by *cc* contacts. For $\eta = 0.3$, *cc* and *cs* contacts participate equally to the shear stress, and for $\eta > 0.3$, the *cs* contacts dominate $(q/p)^*$. Remarkably, $q_{ss}/p \approx 0$ for $\eta < 0.4$. As we shall see below, the *ss* contacts participate to the strong force chains only in the case of the most elongated particles. In this way, the growth of the number of *cs* and *ss* contacts shown in Fig. 24 is clearly at the origin of a gradual consolidation of the packings as η increases.

In order to get further insight into the organization of different contact types, it is useful to consider partial connectivities $P_{cs}(c)$, $P_{cc}(c)$, and $P_{ss}(c)$ defined as the fraction of particles with exactly c contacts of cs type, cc type, and ss type. These functions are displayed in Fig. 26 for all our packings. Note that, by definition $P_{cc}(c) \equiv P(c)$ for $\eta=0$. We see that P_{cc} gets narrower as η increases whereas P_{cs} and P_{ss} get broader. It should be noted that, even for the most elongated particles, a particle can have at most two ss. This means that, the elongated particles tend mainly to pile up like bricks. On the other hand, the peak of P_{cs} slides to the larger values as η increases. For $\eta=0.7$, most particles have three or four cs contacts (for nearly 40%).



FIG. 26. (Color online) Partial connectivity diagrams for all packings in the residual state.



FIG. 27. (Color online) Partial contact orientation anisotropies a_{ccc} (triangle up), a_{ccs} (square), and a_{css} (triangle down) of cc, cs, and ss contacts as the function of η in the residual state. Error bars represent the standard deviation in the residual state.

We now consider the anisotropy of the branch vectors and contact forces supported by the three contact types at the contact and branch frames. Following the same procedure as for the stress tensor [see Eq. (31)], we perform an additive decomposition of the fabric and force tensors

$$\begin{cases} F^* = F_{cc}^* + F_{cs}^* + F_{ss}^* \\ \chi^{ln^*} = \chi_{cc}^{ln^*} + \chi_{cs}^{ln^*} + \chi_{ss}^{ln^*} \\ \chi^{fn^*} = \chi_{cc}^{fn^*} + \chi_{cs}^{fn^*} + \chi_{ss}^{fn^*} \\ \chi^{fr^*} = \chi_{cc}^{fr^*} + \chi_{cs}^{fr^*} + \chi_{ss}^{fr^*}, \end{cases}$$
(32)

where the indices refer to the partial contributions of *cc*, *cs*, and *ss* contacts. The corresponding anisotropies of each tensor can be extracted. In principle, the principal directions of these partial tensors do not coincide with those of the overall tensors at all stages of shearing. But, in practice, in the residual state, the principal directions coincide so that the global anisotropy of each tensor is the sum of its partial anisotropies

$$\frac{q_{\gamma}}{p} \simeq \begin{cases} \frac{1}{2}(a_{c\gamma} + a_{ln\gamma} + a_{lt\gamma} + a_{fn\gamma} + a_{ft\gamma}) & \text{in } (n,t) \\ \frac{1}{2}(a_{c\gamma}' + a_{ln'\gamma} + a_{fn'\gamma} + a_{ft'\gamma}) & \text{in } (n',t'), \end{cases}$$
(33)

where γ stands alternatively for {cc, cs, ss}. This decomposition is nicely verified by our numerical date as shown in Fig. 25.

Since the contact orientation anisotropy expressed in (n, t) frame and the force anisotropy expressed in (n', t') frame provide, respectively, fine descriptions of the geometrical and force organizations (see Sec. V), we restrict here our analysis to the contribution of various contact types to the contact orientation anisotropy a_c and the radial force anisotropies $a_{fn'}$ and $a_{ft'}$. Figure 27 shows the variation of the partial contact anisotropies a_{ccc} , a_{ccs} , and a_{css} due to cc, cs, and ss contacts in the residual state as the function of η . The anisotropy a_{css} of ss contacts increases slowly with η from 0 to 0.18. At the same time, a_{ccc} decreases and at $\eta = 0.7$, we have $a_{css} = a_{ccc}$. Hence, although the ss contacts represent at $\eta = 0.7$ nearly 20% of contacts, their contribution



FIG. 28. (Color online) Partial radial force anisotropies $a_{fn'cc}$, $a_{fn'cs}$, and $a_{fn'ss}$ and partial orthoradial force anisotropies $a_{ft'cc}$, $a_{ft'cs}$, and $a_{ft'ss}$ for different contact types as a function of η in the residual state. Error bars represent the standard deviation in the residual state.

to the contact anisotropy remains modest and of the same order as cc contacts. The variation of the contact anisotropy a_c is thus largely governed by that of a_{ccs} .

Figure 28 shows the partial radial force anisotropies $a_{fn'cc}$, $a_{fn'cs}$, and $a_{fn'ss}$ as well as the partial orthoradial force anisotropies $a_{ft'cc}$, $a_{ft'cs}$, and $a_{ft'ss}$ in the residual state as the function of η . As for contact anisotropies, the *cs* contacts carry most of the radial and orthoradial force anisotropies. The *ss* contacts contribute modestly to the global force anisotropies only for $\eta \ge 0.4$. The anisotropy $a_{fn'cc}$ declines with η , mainly due to their low number, and $a_{ft'cc}$ stays nearly constant.

A map of contact forces projected along the branch vectors is displayed in Fig. 29 in different colors according to the type of contact. For η =0.7, we see that the network of very strong zigzag force chains is composed mostly of *cs* and *ss* contacts and occasionally mediated by *cc* contacts. In contrast, for η =0.2, the *cc* contacts appear clearly to be correlated in the form of long chains across the packing rarely mediated by *cs* contacts. In all cases, the strong force chains are mostly parallel to the direction of compression.

In order to recognize quantitatively the roles of cc, cs, and ss contacts with respect to the force network, we plot in Fig. 30 their respective proportions k_{cc} , k_{cs} , and k_{ss} alternatively for the strong and weak networks in the residual state as a function η . Notice that the data are normalized for each network. The proportion of cc contacts declines rapidly in both networks as η increases whereas that of cs and ss contacts grow. We also remark that the cs contacts are slightly more numerous in the weak network than in the strong network. The proportions have nearly the same value in the two networks for cc and ss contacts.

VIII. CONCLUSIONS

In this paper, we investigated the effect of particle elongation on the quasistatic behavior of sheared granular mate-



FIG. 29. (Color online) Snapshot of radial forces for η =0.2 (up) and η =0.7 (down). Line thickness is proportional to the radial force. The cap-to-cap, cap-to-side, and side-to-side contacts are in black, in red (dark gray), and in green (light gray).

rials by means of contact dynamics simulations. The particle shapes are RCRs characterized by their elongation η defined as deviation from a reference circular shape or alternatively by their aspect ratio. As the elongation increases from 0 to 1, the particle shape varies continuously from a disk to an increasingly thin rectangle with rounded caps. The macroscopic and microstructural properties of several packings of 13 000 particles, subjected to biaxial compression, were analyzed as a function of η .

An interesting finding is that the shear strength is an increasing linear function of elongation, suggesting that the parameter η is a "good" shape parameter for our 2D granular packings. In order to understand the microscopic origins of this behavior, we performed an additive decomposition of the



FIG. 30. (Color online) Proportions of cap-to-cap (k_{cc}) , cap-toside (k_{cs}) , and side-to-side (k_{ss}) contacts in the strong (plain line) and weak (dashed line) networks as a function of η in the residual state. Error bars represent the standard deviation in the residual state.

stress tensor based on a harmonic approximation of the angular variation of average local branch vectors, contact normals, and forces. This approximation of the shear strength in terms of texture and force anisotropies turns out to be in excellent agreement with our numerical data in the investigated range of the elongation parameter ($\eta \in [0, 0.7]$). Given the evolution of various anisotropies with particle elongation, we find that both force and texture anisotropies contribute to the increase of shear strength, but the increasing mobilization of friction force and the associated anisotropy seem to be the key effect of particle elongation. In particular, the proportion of sliding contacts increases strongly as the particles become more elongated. This effect is correlated with a local nematic ordering of the particles which tend to be oriented perpendicular to major principal stress direction. This ordering is enhanced beyond $\eta=0.4$ but remains essentially of local nature. In this respect, the fraction of side-toside contacts increases at large particle elongations. However, the force transmission is found to be mainly guided by cap-to-side contacts, which represent the largest fraction of contacts for the most elongated particles and carry a large part of the shear strength.

In contrast to shear strength, the solid fraction is not a monotonous function of particle elongation; it first increases with particle elongation, then declines as the particles become more elongated. In other words, small deviation from circular shape favors the space-filling aptitude of the particles but beyond a characteristic elongation, the excludedvolume effects prevail and lead to increasingly larger pores which cannot be filled by the particles. It is remarkable that the coordination number does not follow the solid fraction but increases with particle elongation, so that the packings of the most elongated particles are loose but well connected.

Some features discussed in this paper can legitimately be attributed to the two-dimensional geometry of the particles. For example, rounded-cap cylinders (spherocylinders), as three-dimensional analogs of RCR particles in 2D, do not undergo spontaneously a nematic ordering. However, we expect that 3D packings of rounded-cap cylinders behave in many ways as our 2D packings with increasing particle elongation. In particular, the excluded volume effect is reinforced by particle elongation and it leads to a similar nonmonotonous dependence on the elongation as in 2D [20,21,23]. In any case, it would be highly instructive to investigate 3D packings of elongated particles, along the same lines as in this paper. It is also obvious that more work is required to assess the proper role of friction in 2D for RCR particles since friction mobilization seems to underlie to a large extent the shear strength. We are performing presently more simulations with lower values of friction coefficient. In the same way, we consider the effect of cohesion between particles with respect to the shear strength of packings of elongated particles. Finally, it would instructive to investigate the evolution of the system under reversed shearing from the final stages of the simulations presented in this paper. In fact, the mechanical response under reversed shearing should reveal the effect of the anisotropic texture of the packings [96].

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