Bulk modulus along jamming transition lines of bidisperse granular packings

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We present three-dimensional discrete element method simulations of bidisperse granular packings to investigate their jamming densities ϕ_I and dimensionless bulk moduli K as functions of the size ratio δ and the concentration of small particles $X_{\rm S}$. We determine the partial and total bulk moduli for packings near their jamming densities, including a second transition that occurs for sufficiently small δ and X_s when the system is compressed beyond its first jamming transition. While the first transition is sharp, exclusively with large-large contacts, the second is rather smooth, carried by small-large interactions at densities much higher than the monodisperse random packing baseline, $\phi_I^{\rm mono} \approx 0.64$. When only nonrattlers are considered, all the effective transition densities are reduced, and the density of the second transition emerges rather close to the reduced baseline, $\tilde{\phi}_I^{\text{mono}} \approx 0.61$, due to its smooth nature. At size ratios $\delta \leq 0.22$ a concentration X_s^* divides the diagram—either with most small particles nonjammed or jammed jointly with large ones. For $X_{\rm S} < X_{\rm S}^*$, the modulus K displays different behaviors at first and second jamming transitions. Along the second transition, K rises relative to the values found at the first transition; however, is still small compared to K at X_s^* . Explicitly, for our smallest $\delta = 0.15$, the discontinuous jump in K as a function of X_S is obtained at $X_S^* \approx 0.21$ and coincides with the maximum jamming density where both particle species mix most efficiently. Our results will allow tuning or switching the bulk modulus K or other properties, such as the wave speed, by choosing specific sizes and concentrations based on a better understanding of whether small particles contribute to the jammed structure or not, and how the micromechanical structure behaves at either transition.

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I. INTRODUCTION

When a collection of nontouching spheres is externally compressed, there is a critical packing fraction at which the contacts between spheres percolate across the whole system [1–5]. At this state the granular packing develops a mechanically stable structure that can reversibly withstand further external deformation-at least for small enough (infinitesimal) strains [6]. Such a state is known as the jammed state and is characterized by a jamming density ϕ_1 . For stiff, rigid particles, one can talk about "rigidity," whereas for soft particles, the structure and bulk properties of granular packings have been quantified by mechanical properties such as the dimensionless bulk modulus, K. Close enough to jamming, for small enough confining stress and thus small enough contact deformations, the difference between soft and stiff should diminish, while only soft particles allow exploring the jammed state by increasing the deformations [6]. Previous works have shown that ϕ_J and K depend not only on the size ratio δ and on the concentration of small particles $X_{\rm S}$ [5,7–15], but also on the preparation procedure [5,6,16]. For example, this allows tuning the packing density and effective bulk modulus of frictionless particles to the highest values by choosing different combinations of (δ, X_S) for bidisperse packings [12,17]. The multitude of generally possible size distributions (see Ref. [18] and references therein) is not considered here.

In a recent paper [17] we have explored in detail the impact of a wide range of δ and X_S on jamming. Upon compression, bidisperse packings experience an additional transition at low δ and low X_S. Two transitions arise: one driven by predominantly large particles obtained at low densities and the other by jamming small particles jointly with large ones at higher densities upon further compression. This means that the second transition is the source of an additional stiffness of the jammed packing, rather smooth compared to the sharp first transition. This additional transition has opened a new window of research, since packing structures obtained along this additional line might lead to different mechanical properties. Our aim in this work is to study the mechanical properties of bidisperse systems along the jamming lines, especially along the additional transition line found in Ref. [17]. Here we focus on the bulk modulus to quantify both the rigidity of jammed bidisperse packings and also the second transition at higher densities, as it is accessible from isotropic compression. This means that the shear modulus cannot be calculated from this protocol, at least not without additional probing, e.g., as done in Ref. [19]. We also analyze the relevance of rattlers in jammed bidisperse granular packings and the number of contacts along the jamming lines. In general, this work attempts to answer the following questions:.

(a) How does the bulk modulus *K* of a jammed bidisperse packing change as a function of δ and X_S ?

(c) What are the relations between macrovariables like *K* with the microstructural features (packing fraction, contact number, fabric, force networks)?

This paper is organized as follows. In Sec. II we discuss the technique and procedure of the simulation. We define the concentration of small particles, X_S , and discuss how the number of particles in each bidisperse mixture changes with X_S . In Sec. III we explain the jamming diagram and discuss the nature of the second transition line found at low δ and low X_S . Section IV shows the relevance of rattlers on the jamming density and mean contact number along the jamming lines. Section V presents the dependence of the effective bulk modulus at and above jamming on δ and X_S . We conclude with a summary and further discussions.

II. TECHNIQUE AND PROCEDURE OF THE SIMULATION

We use the open source code MERCURYDPM to perform three-dimensional (3D) discrete element method (DEM) simulations to study the macroscopic properties of soft-sphere jammed packings [20–24]. Newton's equations for all particles are numerically solved to analyze their motion in time. $N = N_L + N_S = 6000$ particles are used to set up bidisperse packings, with a number of large, N_L , and small, N_S , particles, with dimensionless radius, $r_L = 1/2$, kept constant, and r_S varied with the size ratio, $\delta = r_S/r_L \in [0.15, 1]$.

In general, we use dimensionless quantities, Γ , using the transformation $\Gamma' = \Gamma \Omega'_u$, where the prime represents the variables with units, variables without prime are dimensionless, and Ω'_u is the scale variable carrying the units, see Ref. [6]. For example, the transformation of the large particle radius is $r'_{\rm L} = r_{\rm L} x'_u$, where we choose the unit of length, $x'_u = 2r'_{\rm L} = 3$ [25], as the large particle diameter, i.e., the dimensionless radius of large particles is $r_{\rm L} = 1/2$. Similarly, the small particle diameter, $2r_{\rm S} = r'_{\rm S}/r'_{\rm L} =: \delta$, defines the size ratio.

The same material density is used for large and small particles, which makes it convenient to choose the unit of density as $\rho'_u = \rho'_p = 2000$, i.e., the dimensionless density is $\rho_p = 1$. Consequently, the unit of mass is $m'_u = 8\rho'_p r_L^3$, so that the dimensionless masses of large and small particles are $m_L = \frac{\pi}{6}$ and $m_S = \frac{\pi}{6} \delta^3 = m_L \delta^3$, respectively.

As a last free unit, we choose the time $t'_u = (m'_u/\kappa'_u)^{1/2}$, proportional to the collision timescale t'_c (see Sec. II B and Appendix A), with stiffness $\kappa'_u = \kappa'_n = 10^5$, so that $\kappa_n = 1$. The unit of time follows from the previous $t'_u = (8\rho'_p/\kappa'_n)^{1/2}r_L^{(3/2)} \approx$ 0.735. The viscous damping used is $\gamma'_n = 1000$, resulting in a dimensionless $\gamma_n = \gamma'_n/(m'_u/t'_u) = \gamma'_n/(8\rho'_p\kappa'_nr_L^{(3)})^{1/2} \approx$ 0.0136. From our nondimensionalization, we obtain the dimensionless pressure as $P = P'(x'_u/\kappa'_u) = 3 \times 10^{-5}P'$. Note that the identity $P = 2r_L P/\kappa_n = 2r'_L P'/\kappa'_n$ is a consequence of our choice of units, but this is not true in general for other choices.

A. Bidisperse systems

A bidisperse packing is characterized by its size ratio δ , the volume concentration of small particles $X_{\rm S} = N_{\rm S} \delta^3 / (N_{\rm L} + N_{\rm S} \delta^3)$, and its density ϕ_J . The former can be controlled, but



FIG. 1. Number of large $N_{\rm L}$ and small $N_{\rm S}$ particles as a function of $X_{\rm S}$ for two typical δ . The total number of particles is set to N = 6000. The inset exhibits four combinations of $(\delta, X_{\rm S})$, corresponding to jammed packings at the maximum compression, $\phi_{\rm max} = 0.90$.

the latter depends, e.g., on the preparation procedure. Figure 1 shows the variation of the number of large and small particles as a function of $X_{\rm S}$ for two typical values of δ . For a particular δ , keeping N constant, the number of small particles increases rapidly, while the large one decreases as $X_S \rightarrow 1$. The intersection point, which represents packings formed by the same amount of small and large particles, $N_{\rm L} = N_{\rm S} = N/2$, is shifted to lower $X_{\rm S}$ as δ decreases, representing the 50:50 bidisperse particle mixture studied previously using $\delta = 0.71$ [4,26]. However, we will argue in Sec. V that using the 50:50 mixture does not provide the densest packing and highest bulk modulus; instead, one has to choose a proper combination of $(\delta, X_{\rm S})$. For the case of $\delta = 0.15$, the intersection point is as low as $X_{\rm S} = 0.01$. Below the intersection point shown in Fig. 1, the packing is formed by small particles in a sea of large ones (not shown, see [12]), while far above, the few large particles are embedded in a sea of small ones, see the insets for $X_{\rm S} = 0.4$.

B. Contact model

We use the linear normal contact force model given as $\mathbf{f}_{ij}^n = f_{ij}^n \hat{\mathbf{n}} = (\kappa_n \alpha_c + \gamma_n \dot{\alpha}_c) \hat{\mathbf{n}}$ [12,20,27], with the contact overlap $\alpha_c = (r_i + r_j) - a_{ij}$, where r_i , r_j , and a_{ij} are the radii and relative separation between the centers of particles *i* and *j*, respectively. $\dot{\alpha}_c$ is the relative velocity in the normal direction $\hat{\mathbf{n}}$. An artificial background dissipation force, $\mathbf{f}_b = -\gamma_b \mathbf{v}_i$, with $\gamma_b = \gamma_n$, proportional to the velocity \mathbf{v}_i of particle *i* is added, resembling the damping due to a background medium.

From the contact model, one can compute [see Appendix A] the contact duration, t_c , and the restitution coefficient, e, both depending on δ . For example, the fastest response t_c corresponds to the interaction between the smallest particles ($\delta = 0.15$) as $t_c^{SS} = t_c'^{SS}/t_u' = 0.07(\kappa_n'/8\rho_p'r_L^{3})^{1/2} \approx 0.09$, together with the strongest dissipation, $e_{SS} = 0.477$, see Appendix A for its definition and Fig. 13 for its variation with δ . The integration time step is chosen to be 50 times smaller



FIG. 2. (Top) Illustration of the evolution of packing fraction ϕ as a function of the dimensionless time *t*. The protocol allows accessing both jamming and unjamming densities of the system. Note that for $\delta = 0.41$, 0.73, the initial target of $\phi_0 = 0.60$ and $\phi_{max} = 0.82$ are chosen, whereas for $\delta = 0.15$, $\phi_0 = 0.70$, and $\phi_{max} = 0.95$. (Bottom) Energy ratio plotted against *t* at $X_S = 0.1$ for different δ . The empty arrows represent where the first jamming transition is identified along the decompression branch, while the solid one corresponds to the second transition. The increase in energy ratio during the relaxation phase is due to E_{pot} decaying faster than E_{kin} , for the larger values of δ that have comparatively weak dissipation.

than this shortest timescale t_c^{SS} . If even smaller size ratios δ would be used, computation time would increase, since finer time steps are needed to resolve the collisions among small particles. We expect similar results for $\delta < 0.15$ but restrict ourselves to a minimal $\delta = 0.15$ for this study. The contact and background dissipation terms are used to damp kinetic energy and reduce computational time during relaxation.

We restrict ourselves to the linear contact model without any friction between particles [19,28]. Thus we exclude all the nonlinearities present in the system due to contact models and focus on the effect of the size ratio and concentration of small particles on jamming.

C. Testing protocol

Each bidisperse packing characterized by the parameters (δ, X_S) is created and further compressed using a unique, well-defined protocol [29], see Fig. 2 (top). The initial configuration is such that spherical particles with dimensionless radii r_L and r_S are uniform and randomly placed in a 3D box without gravity, with an initial packing fraction of $\phi_{ini} = 0.3$ and uniform random velocities. The possible artificial large overlaps lead to a peak in kinetic energy at the beginning, which is quickly damped due to background and collisional dissipation. Such low-density systems with high kinetic energy only help to quickly randomize the particles. Changes in

the initial spatial and velocity distributions should not change the jamming density. The granular gas is then isotropically compressed to approach a direction independent initial configuration with target packing fraction, ϕ_0 , which depends on δ and X_S , being slightly below the jamming density, i.e., the transition from fluidlike to solidlike behavior [4,30–32]. After this initial preparation, randomization, compression phase, where kinetic energy can be considerable to take care that the particle positions are randomized, first, a relaxation process of the system is allowed at constant $\phi = \phi_0$.

The smooth isotropic compression (decompression) up to $\phi = \phi_{\text{max}}$ (back to $\phi = \phi_0$) is realized by a simultaneous inward (outward) movement of all periodic boundaries of the system. For example, the vertical wall position, or height, is given by

$$z(t) = z_f + \frac{z_0 - z_f}{2} (1 + \cos[2\pi (t - t_0)/T]), \quad (1)$$

with strain $\varepsilon_{zz}(t) = 1 - z(t)/z_0$, where z_0 and z_f are the initial and extreme vertical size of the box at zero and maximum strain, respectively. *T* is the dimensionless total time of simulation defined by $T = T'/t'_u \approx 12\,000$, with T' = 9000. Note that the simulation procedure observed in Fig. 2 is driven by the target packing fraction chosen at different stages. During the loading/unloading periods the deformation rate is of the order $\dot{\varepsilon}_v = \dot{\varepsilon}_{xx} + \dot{\varepsilon}_{yy} + \dot{\varepsilon}_{zz} \propto (1 - z_f/z_0) \sin[2\pi (t - t_0)/T]/T$.

The time offset, t_0 , is chosen such that all wall motions by the cosinusoidal function allows for a smooth startup and finish of the motion so that shocks and inertia effects are avoided. Other testing methods could be used [26,33,34]; however, they should have no different outcome since the deformation is very slow, a regime for which the equivalence between our procedure and an energy minimization approach was shown in Ref. [35].

Given sufficient energy is dissipated by either background medium or collisions, this allows us to determine a consistent jamming density at quite low strain rates, see Ref. [36]. To quantify the rate of deformation, it is convenient to define the dimensionless inertial number, $I_v = \dot{\varepsilon}_v d/\sqrt{P/\rho}$, analogous to the shear inertial number [6]. In the existence of background damping, an additional viscous number, I_{γ} , together with I_v , characterizes the rheology of the system, see Refs. [37,38]. Note that rheology is not investigated in this study. The contact and background dissipation are used to remove the energy before the resulting static packings are analyzed. A brief discussion of the role of the background damping in the dynamics of the systems is given in Appendix A.

D. Representative example case

Figure 2 (bottom) shows a log-scale plot of the energy ratio for three bidisperse packings at $X_{\rm S} = 0.1$. We observe that for $\delta = 0.15$, the kinetic energy is decaying, since the collision and background medium dissipate the kinetic energy of the particles. Due to an applied strain, the system has a big chance to rearrange, irreversibly, which creates kinetic energy [6]. Due to both mechanisms, the kinetic energy remains considerable during relaxation and compression, and it decays closer to zero only after rearrangements and when decompression

starts slowly. For higher δ , the kinetic energy drops towards zero only later, at the respective jamming densities. Such differences in the behavior of the kinetic energy during loading and unloading (compression and decompression) are due to a different relaxation densities and due to the different elasticity of collisions between particles, e.g., $e \sim 0.95$ at higher δ , see Fig. A. In this case, background dissipation might take place by dissipating most of the kinetic energy. After the relaxation period, the system is further isotropically compressed (loading) until a target maximum packing fraction $\phi_{max} > \phi_J$ is achieved, which depends on the values of (δ, X_S) chosen, see Fig. 2 (top). Along this process, the remaining kinetic energy of the system drops to near zero, $E_k/E_p \approx 10^{-6}$, suggesting the development of the jammed packing. Plotting E_k/E_p in log scale, one can see that many things are happening when $E_k/E_p \rightarrow 0$, see Fig. 2 (bottom). Here, multiple peaks appear due to particle rearrangements. However, we cannot be sure if these particle rearrangements affect the macroscopic behavior of the system. This has started to be studied [6,16], but it is not still conclusive. After the loading process, the isotropic decompression (unloading) starts until the initial ϕ_0 is reached again. In this case, all potential energy due to overlaps is translated into kinetic energy, revealing the unjamming behavior of the systems. Once the simulation protocol ends, the jamming density, see the arrows in Fig. 2 (bottom), and bulk modulus of each bidisperse packing are determined from the decompression branch, since these values are less sensitive to the rates of deformation [29]. Note that the open arrows (first, lower transition) show up short before the kinetic energy ratio rises sharply, while the solid arrow (second transition) is not accompanied by such a feature-which is due to and compatible with our procedure and choice to report the jamming transitions on the unloading path: the second transition has mostly large particles jammed, see Sec. III.

III. JAMMING DENSITY: FIRST AND SECOND TRANSITION

We quantify the fraction of large particles, $n_{\rm L} = N_{\rm L}^c / N_{\rm L}$, and small particles, $n_{\rm S} = N_{\rm S}^c / N_{\rm S}$, contributing to the force network as a function of ϕ for different δ and $X_{\rm S}$. $N^c = N_{\rm L}^c + N_{\rm S}^c$ is the number of large and small particles in contact, while $N_{\rm L}$ and $N_{\rm S}$ are the total number of large and small particles in the system. Figure 3 shows jumps in $n_{L,S}$ at different (δ , X_S), which are equivalent to the jumps in the total mean contact number, see Ref. [17]. A clear decoupling of the behavior of $n_{\rm L}$ and $n_{\rm S}$ is found at lower δ and lower $X_{\rm S}$, see Fig. 3(a), while for higher values of δ , both types of particles contribute simultaneously to the jammed structure, see Figs. 3(b) and 3(d). Such decoupling indicates that the fraction of small particles that is jammed is large only at higher densities, whereas large particles are jammed already at lower densities. To extract more precisely the value of the jamming density where $n_{\rm I}$ and $n_{\rm S}$ jump, we compute the first derivative $\partial n/\partial \phi$ for each particle size. Figure 4 shows the derivatives of $n_{\rm L}$ and $n_{\rm S}$ as functions of ϕ , showing a characteristic peak (maximum derivative) at values consistent with the respective ϕ_J . For $\delta = 0.15$ and $X_{\rm S} = 0.1$, the peak for large particles is found at small ϕ , while the peak for small particles is obtained at higher density, see Fig. 4(a). The smaller peak amplitude is



FIG. 3. Fraction of large $n_{\rm L}$ and small $n_{\rm S}$ particles in contact, as functions of the packing fraction ϕ , for different combinations of δ and $X_{\rm S}$.

due to the smooth behavior of n_S [39] compared to n_L , but still, a critical density can be extracted, representing the largest increase in the number of small particles jammed, see the inset in Fig. 4(a). This evidences that the system experiences a transition from a predominantly large particle structure to one where both particle sizes contribute upon compression. On the other hand, at higher δ , the peaks for both fractions of particles show the same ϕ_J , indicating that both particle sizes are forming the jammed structure together, see Figs. 4(b)– 4(d). Therefore, using this method one can extract the values of ϕ_J for the entire range of δ and X_S .



FIG. 4. Derivatives of $n_{\rm L}$ and $n_{\rm S}$ as functions of the packing fraction for different combinations of δ and $X_{\rm S}$. The maximum value of each derivative is considered to occur at the jamming density, ϕ_J . The five-point difference method with accuracy $\sim O(\Delta \phi^4)$ was used. The inset is a zoom-in around the peak of the derivative of $n_{\rm S}$. A clear peak is seen at $\phi \approx 0.87$, representing the largest increase in the number of small particles jammed.



FIG. 5. Jamming density ϕ_J as a function of the concentration of small particles X_S for different size ratios δ . The extreme X_S values (0 and 1) correspond to monodisperse systems, which exhibit $\phi_J^{\text{mono}} = \phi_{\text{RCP}} \approx 0.64$, as indicated by the dashed horizontal line. Solid lines represent the Furnas model of Eq. (1) in Ref. [17]. Open (solid) symbols represent the first (second) transition line. The arrow corresponds to the end point of the second transition X_S° , given in Fig. 3, at $\phi_J \approx 0.87$.

Figure 5 displays such extracted ϕ_I values, where smaller δ results in jamming at higher densities for intermediate $X_{\rm S}$. Additionally, an increasing line of jamming densities is observed for smaller $X_{\rm S}$. Such a line extends the transition where both size particles are jammed for a low range of $X_{\rm S}$, thus introducing a more complete jamming diagram for bidisperse packings. This new feature of the jamming density already was reported in Ref. [17], where the authors made the distinction between two jammed states depending on whether small particles are jammed together with the large ones or not. This work also showed that the second transition starts at a size ratio below around $\delta = 0.22$ and grows longer, extending towards smaller and smaller X_S , for decreasing δ . Comparison to an asymptotic model introduced by Furnas in Ref. [40], see Fig. 5, suggests that if the size ratio of the particle types is extreme ($\delta \rightarrow 0$), ϕ_J can decouple into two limiting cases, sharing a common point at a specific $X_{\rm S}^*$. One limit considers an approximation where large particles dominate the jammed structure, while small particles are not taken into account since they are too few, too small to play any role ($0 \leq X_S <$ $X_{\rm S}^*$). In the second limit, both large and small particles participate in the jammed structure ($0 \leq X_S \leq 1$). In this case, the number of small particles is large enough to contribute and even drive a few large particles into the jammed state. The former limit indicates that small particles would induce contact only once they fill the remaining space. Therefore the Furnas model predicts a maximum density of $\phi_J(X_s^*) \approx 0.87$ at $X_{\rm S}^* = (1 - \phi_{\rm RCP})/(2 - \phi_{\rm RCP}) \approx 0.26$, where both line limits meet. This is in reasonable vicinity of the value obtained here from our simulations for $X_{\rm S}^* \approx 0.21$ and $\delta = 0.15$. In Fig. 5, the second transition line given by the simulation data qualitatively follows the Furnas model ending at $X_{S}^{\circ} = 0.1$ for



FIG. 6. Dimensionless mean overlap, $\langle \alpha_c \rangle = \langle \alpha'_c \rangle / 2r'_L$, for each contact type as a function of X_S for different δ . The values correspond to the jamming line where both species of particles contribute to the jammed structure. Open (solid) symbols represent the first (second) transition line. The dashed vertical line highlights the end point found at $X_S = 0.1$ for $\delta = 0.15$, represented by the arrow in Fig. 5. (Some noise in the data comes from the fact that we are slightly above jamming, where a tiny variation may have a big effect.)

 $\delta = 0.15$. The transition stops at this value, since for $X_{\rm S} < X_{\rm S}^{\circ}$ no jumps in the fraction of small particles contributing to the jammed structure are found (see Supplementary Information of Ref. [17]). The additional line terminates at an end point at some finite $X_{\rm S}^{\circ}$, which depends on δ , unlike in the Furnas model.

In Ref. [15] the authors have shown that the jamming density of bidisperse packings can be lower than the monodisperse case when $\delta \rightarrow 1$ and $X_S \rightarrow 0$. This behavior is not visible in our Fig. 5 for $\delta = 0.73$ at $X_S < 0.1$, since too few data points are available in this regime that is not the focus of this study. Nevertheless, the jamming density without rattlers exhibits lower values than for the monodisperse case, see Fig. 7. For $\delta \rightarrow 1$, where small particles are similar to large ones, and $X_S < 0.1$, we expect that the few small particles more likely become rattlers inside the jammed structure formed by large particles, so that ϕ_J could decay below ϕ_J^{mono} . However, this needs to be further investigated in detail.

The high packing fractions and high pressures for which the second transitions are found, in Fig. 5, might suggest a high level of overlap (deformation) between the already jammed large particles in the system. Such extreme overlaps could lead to nonphysical granular packings, since stiff real particles typically would break, possibly causing a much



FIG. 7. Jamming density without rattlers $\tilde{\phi}_J$ as a function of the concentration of small particles X_S for different values of the size ratio δ . The dashed and dotted horizontal lines correspond to the jamming density of monodisperse systems with ($\phi_J^{\text{mono}} \approx 0.64$) and without rattlers ($\tilde{\phi}_J^{\text{mono}} \approx 0.61$). The Furnas model is represented by the solid lines, see Eq. (1) in Ref. [17], where $\tilde{\phi}_J^{\text{mono}}$ was used as input. This shifts the model slightly downwards in the packing fraction. Open (solid) symbols represent the first (second) transition line

different system behavior. To quantify this, we determine the mean overlap, $\langle \alpha_c \rangle = \langle \alpha'_c \rangle / x'_u = \langle \alpha'_c \rangle / 2r'_L$, for LL, SS, and LS contact types along the lines where both particle species contribute to the jammed structure. Figure 6 and Appendix D show the values of $\langle \alpha_c \rangle$ as a function of X_S at different δ . For $\delta \ge 0.41$, the jammed packings show a mean overlap close to zero for all $X_{\rm S}$. For $\delta < 0.41$ and $X_{\rm S} < X_{\rm S}^*$, the mean overlap increases for each contact type along the second transition as a result of overcompression. However, the partial $\langle \alpha_c \rangle$ for the large particles is still quite low at the second transition. The second transition presented here at low δ and low $X_{\rm S}$ can be obtained by considering experimental possibilities; an overlap of around a few percent can be easily obtained in 3D experiments of soft PDMS sphere packings [9], since the maximum overlap of such a typical sphere can reach about 10%. In 2D, soft photoelastic, birefringent disks can be used as well, since a mean overlap of 3% for $\delta = 0.71$ has been readily obtained in, e.g., Ref. [4].

IV. ANALYSIS WITHOUT RATTLERS

In 3D simulations of particles without friction and without gravity, rattlers are those particles having less than four contacts. Rattlers are not mechanically stable and do not contribute to the force distribution [12,26,41,42]. This indicates that the removal of rattlers would strongly affect variables such as the jamming densities found in Fig. 5; how much are the mean contact number and packing density affected? Here, we first recalculate ϕ_J , considering only those particles *i* having four contacts or more ($\tilde{Z}_i \ge 4$), where the tilde indicates the fact that rattlers are recursively excluded from the contact network. This means that we monitor if new particles with $\tilde{Z}_i < 4$ are created after the removal of rattlers. If so, we



FIG. 8. Partial jamming density without rattlers $\tilde{\phi}_{L,S}$, as a function of X_S , for different δ . Open (solid) symbols represent the first (second) transition line. The sum $\tilde{\phi}_L + \tilde{\phi}_S = \tilde{\phi}_J$ leads to the jamming densities shown in Fig. 7.

have to remove new rattlers from the contact network. This is repeated until no rattlers remain in the packing.

Figure 7 shows the jamming density without rattlers, ϕ_J , as a function of X_S , complementing Fig. 5. We present the same four typical size ratios, but similar explanations can be applied for other values of δ . Obviously, all $\phi_J < \phi_J$, affecting also the monodisperse lower limit, $\phi_J^{\text{mono}} \approx 0.61$. The jamming densities along the first transition line, between $0.1 \leq X_S < X_S^*$, are qualitatively similar to the monodisperse case, irrespective of δ , only lower and with some more scatter. This confirms that only large particle nonrattlers are forming a monodisperse jammed structure.

For all δ and $X_S \ge X_S^*$, the first transition jamming densities follow the Furnas' model trend, showing a similar maximum at X_S , like in Fig. 5. However, for the smallest δ , when $X_S \rightarrow X_S^* \approx 0.21$ from the right, $\tilde{\phi}_J$ shows a different feature of the transition. For larger X_S , the system structure is formed by large and small particles, while for smaller X_S , only large particles carry forces. The additional second transition of $\tilde{\phi}_J$ is also shown above the first transition, between $0.1 \le X_S < X_S^*$, as shown by the solid symbols in Fig. 7. However, the jamming density of small particles on top of large particles is displaced downwards due to the removal of rattlers. Rather than continuing the trend from right to left, X_S decreasing, the second transition nonrattler jamming density drops and emerges from the monodisperse lower limit.

The jamming densities shown in Fig. 7 can be better understood by analyzing the packing fraction of either large or small particles, having more than four contacts, along the first and second transition lines. This scenario is shown in Fig. 8. For all δ along the first transition and between $0.1 \leq X_S < X_S^*$, one has $\tilde{\phi}_J = \tilde{\phi}_J^{\text{mono}} \approx 0.61$ (dotted line). The packings behave like a monodisperse system of large particles, as most evident for $\delta = 0.15$, where $\tilde{\phi}_L \approx 0.61$, whereas $\tilde{\phi}_S = 0$, see Fig. 8(a). Then, $\tilde{\phi}_S(\delta = 0.15)$ jumps to a finite value at $X_S = X_S^* \approx$ 0.21, indicating the transition to both species contributing. For



FIG. 9. Partial mean contact numbers without rattlers determined at $\tilde{\phi}_J$ as a function of X_S for different δ . Open (solid) symbols represent the first (second) transition line. The dashed line represents $Z_{iso} = 6$ expected for 3D frictionless monodisperse granular packings at jamming.

 $X_{\rm S} > X_{\rm S}^*$, $\tilde{\phi}_{\rm S}$ and $\tilde{\phi}_{\rm L}$ increase or decrease, respectively. Along the second transition, $X_{\rm S} < X_{\rm S}^*$, the large particles always dominate the density over small ones. For all δ , an intersection point of equal-volume contribution is found at $X_{\rm S} \approx 0.5$. For instance, for $\delta = 0.15$, $\tilde{\phi}_{\rm L} = \tilde{\phi}_{\rm S} = 0.37$, while for $\delta = 0.73$, $\tilde{\phi}_{\rm L} = \tilde{\phi}_{\rm S} = 0.31$. Above and below the intersection point, the small and large species dominates the first jamming of the system.

Looking deeper into the packing, we determine the partial mean contact numbers using

$$\tilde{Z}_{LL} = \frac{\sum_{i=1}^{N_{LL}^{i}} \tilde{Z}_{LL}^{i}}{\tilde{N}_{L}},$$
(2)

$$\tilde{Z}_{\rm LS} = \frac{\sum_{i=1}^{N_{\rm LS}^c} \tilde{Z}_{\rm LS}^i}{\tilde{N}_{\rm L}},\tag{3}$$

$$\tilde{Z}_{\rm SS} = \frac{\sum_{i=1}^{N_{\rm SS}^c} \tilde{Z}_{\rm SS}^i}{\tilde{N}_{\rm S}},\tag{4}$$

$$\tilde{Z}_{\rm SL} = \frac{\sum_{i=1}^{N_{\rm SL}^c} \tilde{Z}_{\rm SL}^i}{\tilde{N}_{\rm S}},\tag{5}$$

where each sum is running over the number of contacts (LL, LS, SS, SL) in the packing, respectively. We have divided by \tilde{N}_L and \tilde{N}_S to examine the contribution of each contact type to the total coordination, $Z = Z_L + Z_S$ (with $Z \ge 4$). For instance, at large X_S the few large particles in the system have particularly large \tilde{Z}_{LS} , since they are surrounded by many small ones. At the same time, \tilde{Z}_{SL} is near zero, since each small particle is in contact with very few or no large ones. As expected, not shown, $Z_{LS} = Z_{SL}$ if in Eqs. (3) and (4) the denominator is replaced by the total $\tilde{N} = \tilde{N}_L + \tilde{N}_S$.

Figure 9(a) shows $\tilde{Z}_{LL} \approx Z_{iso} = 6$ for $\delta = 0.15$ between $0.1 \leq X_S < X_S^*$, while \tilde{Z}_{SS} remains zero (open circles). This is one of the reasons that both jamming density and bulk modulus have approximately constant values in this regime of





FIG. 10. Partial dimensionless pressures *P* as a function of ϕ for four combinations of δ and *X*_S. Note the different horizontal axis scaling top-left and the extreme overlaps (deformations) at large ϕ . The arrow indicates the second transition, $\phi_J \approx 0.87$, extracted by the derivative of *n*_S, see Figs. 3 and 4.

 $X_{\rm S}$, see Figs. 5 and 12, respectively. For higher $X_{\rm S} > X_{\rm S}^*$, $Z_{\rm LL}$ and $\tilde{Z}_{\rm SL}$ decay to zero while $\tilde{Z}_{\rm SS}$ and $\tilde{Z}_{\rm LS}$ increase. Note that $\tilde{Z}_{\rm SS} \approx Z_{\rm iso}$ as $X_{\rm S} \rightarrow 1$, since the jammed packing is formed by small particles only.

Along the second transition line, \tilde{Z}_{LL} and \tilde{Z}_{LS} decrease within $0.1 \leq X_S < X_S^*$. Note that $\tilde{Z}_{LL} > \tilde{Z}_{iso}$ along the second transition, since the packing is becoming denser so that the overlaps and the contact numbers between large particles increase with decreasing X_S . The mixed contacts of large particles, \tilde{Z}_{LS} , show many contacts with small ones for $\delta = 0.15$ with a dip at $X_S \approx X_S^*$. In contrast, the contacts related to small particles display a maximum at $X_S \leq X_S^*$.

The results presented in Fig. 9 show how differently the two-particle species in the bidisperse granular packing contribute to its rigid structure along the first and second jamming transition. Similar values of the partial mean contact number along the first jamming transition were reported in Ref. [10], disregarding the second transition.

V. BULK MODULUS NEAR THE JAMMING DENSITY

Here we focus on the pressure of each particle species, since they are the most important variable to determine how much they contribute to the force network and thus to the bulk modulus. Therefore rattlers are considered since they can also contribute to the stiffness of the jammed packing upon compression. Appendix B shows the derivation of the large and small dimensionless pressures: $P_{\rm L} = 2r'_{\rm L}P'_{\rm L}/\kappa'_n$ and $P_{\rm S} = 2r'_{\rm L}P'_{\rm S}/\kappa'_n$, respectively.

Figure 10 shows typical evolutions of the dimensionless pressures of each particle size with packing fraction ϕ for four combinations of δ and X_S . Irrespective of X_S , P_L and P_S show values of zero at very low ϕ since the system is not jammed. When the system becomes jammed, P_L and P_S start showing nonzero values for $\phi > \phi_J$. For $X_S = 0.4$, Figs. 10(b) and 10(d) show that each type of P starts rising simultaneously, both contributing to the jammed structure, at $\phi_J \approx 0.77$ (for $\delta = 0.15$) and $\phi_J \approx 0.70$ (for $\delta = 0.41$). For $X_{\rm S} = 0.1$, the values of P for $\delta = 0.41$ show a similar behavior to those found for $X_{\rm S} = 0.4$, see Fig. 10(c). However, by reducing the size ratio until $\delta = 0.15$, P shows a different scenario, see Fig. 10(a). In this case the jamming of the system is initially driven by the jammed structure formed by large particles at $\phi_J \approx 0.71$. At this value the small particles are located in the cages formed by the large ones having zero contacts and contributing zero partial pressure, as was previously indicated in Refs. [12,17]. This scenario, where predominantly large particles are jammed, has been widely considered in the literature as the jamming state of a bidisperse system, but it is the jamming state of a monodisperse packing of large particles with only a few contacts among small particles carrying load [12]. Making the packing denser, some small particles make contact with the structure of large particles, revealing a continuous rising but low value of $P_{\rm S} \ll P_{\rm L}$ driven mainly by LS contacts particles (not shown explicitly here); see the weak increase of $n_{\rm S}$ and $P_{\rm S}$ around $\phi_J \approx 0.76$ given in Figs. 3 and 10(a). Then at higher densities a large number of small particles quantified by $n_{\rm S}$ get jammed at $\phi_J \approx 0.87$ contributing considerably $P_{\rm S} < P_{\rm L}$. In this case, both SS and SL contacts contribute to P_S , see Fig. 14(a). Similar behaviors are obtained when looking at the partial mean contact number where a discontinuity at jamming is also found, see Ref. [17].

Each of the jamming density values displayed in Fig. 5 represents a jammed structure that can show resistance when the external stress is applied. The system behaves like an elastic solid. One of the properties that quantifies the mechanical behavior of granular packings is the bulk modulus $K = \phi \, \partial P / \partial \phi$, the change of pressure P, with packing fraction ϕ . To determine the dimensionless bulk moduli $K_{\rm L}$ and $K_{\rm S}$ as a function of ϕ , we use the empirical fit equation P = $P_0(\phi - \phi_J)^a$ to approximate the dimensionless pressures $P_{\rm L}$ and $P_{\rm S}$. This is consistent with Ref. [17], where one jamming density was determined for each particle size. In previous works [2,4] a value of $a \approx 1.1$ for $\delta = 0.71$ was reported. We find here that the power *a* depends on the pressure, for each particle size, and on the combination (δ, X_S) . In particular, we find that for high δ the fitting parameters of the power law do not change too much with the fitting range and thus the fitting range is arbitrary, see Fig. 15. However, at low δ the fitting parameters for $P_{\rm S}$ are quite sensitive to the fitting range while those related to $P_{\rm L}$ only slightly vary, see Fig. 16. We think that such variations of $P_{\rm S}$ are caused by the high overlaps developed at high ϕ , which tend to modify the fitting parameters. Therefore we fit $P_{\rm S}$ in smaller ranges, near to ϕ_J , keeping $a_{\rm S}$ as close as possible to $a_{\rm L}$. This results in low overlaps and similar power laws between large and small particle pressures. Full details of the fitting parameters are given in Appendix C.

Once the fitting parameters for P_L and P_S are extracted, one can determine the dimensionless bulk moduli of large and small particles using their definition: $K = \phi P_0 a (\phi - \phi_J)^{a-1}$. Figure 11 shows the partial dimensionless bulk moduli as a function of ϕ for the same combinations of (δ, X_S) as in Fig. 10. We can see a jump, similar to those observed in Fig. 3, for both particle sizes at high δ and high X_S , see Figs. 11(b)– 11(d), least pronounced in 11(c). However, Fig. 11(a) shows two behaviors of K_L and K_S , jamming at different ϕ , with



FIG. 11. Dimensionless bulk modulus K as a function of ϕ for four combinations of δ and $X_{\rm S}$. The arrow indicates the second transition, $\phi_J \approx 0.87$, shown in Fig. 3.

and without a jump, respectively. This confirms that at lower densities large particles jam first, forming a structure with an overall bulk modulus. Then, at $\phi \approx 0.76$, some small particles make contact with large ones, leading to $K_{\rm S} \neq 0$. Increasing ϕ , small particles make gradually more contact with large ones until a considerable amount of small particles make many contacts also with those small particles already jammed, see the arrow in Fig. 11(a) and the jump in Fig. 3(a). Although no jump in K_S is obtained here, a jump in the bulk modulus between small-small particles K_{SS} is indeed observed, see Fig. 14(e). Such a jump is hidden by the bulk modulus given by the mixed contacts $K_{LS} = K_{SL}$, since it dominates K_S . The second transition where small particles are jammed jointly with large ones indicates a different packing structure with a higher bulk modulus according to $K = K_{\rm L} + K_{\rm S}$. For the case of the force network, large particles carry high forces while small ones carry low forces, as has been presented in Refs. [23,24] and confirmed by our overlap data shown above in Fig. 6. However, it would be interesting to study how the force distribution changes according to size ratio and concentration of small particles, especially for lower size ratios where the second transition appears. The results shown in Fig. 11 demonstrate that for low δ and $X_{\rm S}$, small particles jam only at large ϕ to provide a different jammed structure and consequently, a higher bulk modulus.

Next we extract the dimensionless bulk modulus at ϕ slightly above each jamming density shown in Fig. 5. As an arbitrary choice, we evaluate the data when $\phi - \phi_J$ reaches 1% above each ϕ_J . Figure 12 shows the variation of the partial and total *K* as a function of X_S for different values of δ . For $\delta \ge 0.41$ and low X_S , large particles dominate the structural resistance over small ones, $K_L > K_S$. At larger X_S , K_L is reduced while K_S increases, showing an intersection point at a specific $X_S(\delta)$. This point marks the onset of domination of the small particles in the structure over the large ones, $K_S \ge K_L$. The intersection point between K_L and K_S has nothing to do with the intersection point shown in Fig. 1. In



FIG. 12. Partial and total dimensionless bulk modulus *K* as a function of X_S for different δ . Open (solid) symbols represent the first (second) transition. These *K* values were obtained roughly 1% above the jamming density ϕ_J shown in Fig. 5, which causes the ambiguous scatter. The dashed line corresponds to the total dimensionless bulk modulus for monodisperse packings, $K_{mono} \approx 0.76$. Note the different vertical axis scaling in the top panel. The arrow indicates the second transition shown in Fig. 3(a), $\phi_J \approx 0.87$.

the traditional 50:50 mixture cases, the bulk modulus is not equally distributed but is dominated by the large particles.

Interestingly, the total dimensionless bulk modulus for the larger $\delta \ge 0.41$ is largely independent of X_S , showing almost constant values, almost the same as monodisperse packings for $K_{\text{tot}}(\delta = 0.73) \approx 0.76$. For even smaller $\delta = 0.15$, a different behavior is found. Along the first transition (open symbols), K_L shows a constant value for $0.1 \le X_S < X_S^*$, while $K_S = 0$, indicating that predominantly large particles provide the resistance of the system. At $X_S^* \approx 0.21$, both K_L and K_S show a jump to a specific value, which is consistent with the peak in ϕ_J shown in Fig. 5. For $X_S > X_S^*$, K_L decays to zero, whereas K_S increases until the small particles dominate the structural resistance of the system. The total dimensionless bulk modulus K_{tot} shows a similar jump at X_S^* , exhibiting its highest value at $X_S \approx 0.35$ and then tending to the monodisperse value as $X_S \rightarrow 1$.

As was demonstrated in Ref. [17] and shown in Fig. 5, small particles, indeed, begin to strongly contribute to the jammed structure already formed by large particles—as indicated by the jump in *K* at the second transition. This makes the system stiffen, showing a second transition line at low X_S and low δ , see solid symbols in Fig. 12. Along the second transition line, K_S indeed increases within $X_S \in [0.1, 0.21]$, contrary to the zero values found along the first transition. In this range, K_S increases while K_L decreases with increasing X_S towards $K_{tot} \approx K_{mono}$. The gap between the first and second transition obtained at low X_S for K_{tot} demonstrates that the structural resistance increases by around 50% when small particles contribute to the jammed structure of the system.

In a very recent paper, similar results of the bulk modulus as a function of X_S were shown [13]. The authors found jumplike behavior for $\delta = 0.17$ near $X_S \approx 0.21$ for very low pressure levels, indicating the first jamming transition. While the authors did not explicitly identify the additional transition line shown in Fig. 5, their results suggest that the small particles can cause the second transition at higher pressure levels.

VI. SUMMARY, CONCLUSIONS, AND OUTLOOK

In summary, we show that in bidisperse packings of soft particles, the dimensionless bulk modulus K can show both sharp and smooth transitions at first or second transition depending on which parameters are changed. Its magnitude depends on whether large and small particles jam simultaneously or not. We find a critical combination of size ratio and concentration of small particles ($\delta_c = 0.22, X_S^* \approx 0.21$), below which the jamming density and bulk modulus present a new, additional transition, mostly disregarded, except in some previous literature [12,17]. For $\delta > \delta_c$ and $X_S > X_S^*$, the bulk modulus comes from a structure formed by both large and small particles that simultaneously jam at the same density. However, for $\delta < \delta_c$ and $X_S < X_S^*$, the bulk modulus displays two transitions obtained at different densities that depend on particle size. This means that large particles first jam at low densities, forming an initial structure where small ones mostly do not contribute. It is only at higher densities that the small particles start to get jammed jointly, with large particles forming a different structure.

The highest bulk modulus was observed at $X_{\rm S}^{K_{\rm max}} \approx 0.35$, for the lowest size ratio considered, $\delta = 0.15$, which is far from the highest jamming density shown in the jamming diagrams in Figs. 5 and 7. Although many small particles are jammed below (δ_c , $X_{\rm S} < X_{\rm S}^*$), the total bulk modulus shows a much lower magnitude compared to the bulk modulus above (δ_c , $X_{\rm S} > X_{\rm S}^*$), see Fig. 12. Indeed, for $\delta = 0.15$, *K* increases by approximately 50% to the case when small particles are jammed jointly with large ones at a higher density. This suggests that distinct jammed structures are created at first and second transitions, where much stiffer structures are created for larger $X_{\rm S}$.

The behavior of the bulk modulus and its relation to the jamming density, as presented along the first and second jamming transitions, have given better insights into the mechanical properties of jammed bidisperse systems. By tuning the values of δ and X_S , one can get stiffer or less stiff bidisperse structures. The different values of the bulk modulus obtained here suggest that other properties such as shear modulus, vibrational density of states, or force distributions must be different as well.

Future research could aim at understanding how ϕ_J changes when different materials (different restitution coefficients *e*, dissipation by contact damping γ_n , or background damping γ_b), different contact friction coefficients, $\mu_p > 0$, different size and shape distributions, or different testing protocols (compression rates) are used. This would give us a broader overview of the dependence of the jamming density on particle properties, the surrounding medium, and also

protocols or methods and modes of deformation (isotropic vs shear or deviatoric). This might eventually allow understanding the interplay of a fluid with the particles when (a) small fines are washed out of a matrix formed by jammed larger particles, or (b) the dynamics and statics of suspended particles possibly display a crossover from a viscosity dominated, slow regime to an inertial dominated, more rapid flow state where the large and small particles interact with the fluid in strongly different ways.

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APPENDIX A: RESTITUTION COEFFICIENT VS SIZE RATIO

The restitution coefficients between particles i = L,S and j = L,S, for the linear contact model used are given by

$$e_{ij} = \exp\left(-\frac{\gamma_n t_c^{ij}}{2m_{ij}}\right),\tag{A1}$$

with the normal damping γ_n , the effective mass, $m_{ij} = m_i m_j / (m_i + m_j)$, and the contact duration time t_c^{ij} such that

$$m_{\rm LL} = \pi / 12 = m_{\rm L} / 2,$$
 (A2)

$$m_{\rm SS} = m_{\rm LL} \,\delta^3, \tag{A3}$$

$$m_{\rm LS} = m_{\rm SL} = 2m_{\rm LL} \left(\frac{\delta^3}{1+\delta^3}\right),\tag{A4}$$

$$t_c^{ij} = \frac{\pi}{\sqrt{\frac{\kappa_n}{m_{ij}} - \left(\frac{\gamma_n}{2m_{ij}}\right)^2}},$$
(A5)

where the dimensionless variables $\kappa_n = 1$, $\rho_p = 1$, and $\gamma_n = 0.013$ are inserted.

The dependence of e with δ is shown in Fig. 13. We observe that e_{SS} and e_{LS} decrease as $\delta \rightarrow 0$, while e_{LL} does not change since the radius of the large particles is constant. For $\delta = 0.15$ (dashed line), $e_{LL} = 0.95$, $e_{SS} = 0.47$, and $e_{LS} = e_{SL} = 0.59$, respectively. This demonstrates how the dissipation of each contact type depends on δ . The fact that large $\delta \rightarrow 1$ results in rather weak dissipation is one reason for using the background dissipation. However, we believe that even though competition between the energy dissipated by collisions and the energy dissipated by the background medium might take place, this should be relevant only in dynamic situations. This can be seen in the energy ratio given in Fig. 2 (bottom), where for $\delta = 0.4$ and $\delta = 0.73$, the potential energy dominates over kinetic energy, during the whole process, above jamming, by orders of magnitude. For static packings created by a slow enough, quasistatic deformation, the interplay between dissipated energies should neither play a role in the determination of the jamming density [16] nor for pressure and thus bulk modulus.



FIG. 13. Partial restitution coefficients are plotted against the size ratio δ . The vertical dashed line corresponds to the smallest value used, $\delta = 0.15$. Note that for $\delta \rightarrow 1$, e_{SS} , $e_{LS} \rightarrow e_{LL} = 0.95$. e_{ij} stops at $\delta = 0.0564$, since below imaginary values are obtained for e_{SS} and e_{LS} .

APPENDIX B: PARTIAL PRESSURE DEFINITIONS

The dimensionless pressure and the components of the stress tensor are defined by

$$P = \frac{2r'_{\rm L}}{\kappa'_n}P' = \frac{1}{3}{\rm tr}\{\sigma_{\alpha\beta}\}; \quad \sigma_{\alpha\beta} = \frac{1}{V}\sum_{c\in V}f_{\alpha}\ell_{\beta}, \qquad (B1)$$

where f_{α} is the dimensionless force components and $\ell_{\beta} = r_{\beta}^{j} - r_{\beta}^{k}$ are the dimensionless branch vector components connecting the center of the particles *k* and *j* that share contact *c*. The sum over all contacts in the volume *V* can be decomposed into four sums, each one running over each contact type in the system: LL, SS, LS, SL. This is written as

$$\sigma_{\alpha\beta} = \frac{1}{V} \sum_{i=1}^{N_{LL}^{c}} f_{\alpha i}^{LL} \ell_{\beta i}^{LL} + \frac{1}{V} \sum_{i=1}^{N_{SS}^{c}} f_{\alpha i}^{SS} \ell_{\beta i}^{SS} + \frac{1}{2V} \sum_{i=1}^{N_{LS}^{c}} f_{\alpha i}^{LS} \ell_{\beta i}^{LS} + \frac{1}{2V} \sum_{i=1}^{N_{SL}^{c}} f_{\alpha i}^{SL} \ell_{\beta i}^{SL}, \qquad (B2)$$

where N_{LL}^c , N_{SS}^c , N_{LS}^c , and N_{SL}^c are the number of contacts of each contact type, with $N_{LS}^c = N_{SL}^c$. Applying the property tr{A + B} = tr{A} + tr{B}, dividing by 3 in Eq. (B2), and using the definition of pressure given in Eq. (B1), one arrives at

$$P = P_{\rm LL} + P_{\rm SS} + \frac{1}{2}(P_{\rm LS} + P_{\rm SL}), \tag{B3}$$

where

$$P_{\rm LL} = \frac{1}{3V} \sum_{i=1}^{N_{\rm LL}^{\rm L}} f_{\alpha i}^{\rm LL} \ell_{\alpha i}^{\rm LL}, \qquad (B4)$$

$$P_{\rm SS} = \frac{1}{3V} \sum_{i=1}^{N_{\rm SS}^c} f_{\alpha i}^{\rm SS} \ell_{\alpha i}^{\rm SS}, \tag{B5}$$

$$P_{\rm LS} = \frac{1}{3V} \sum_{i=1}^{N_{\rm LS}^c} f_{\alpha i}^{\rm LS} \ell_{\alpha i}^{\rm LS}, \qquad (B6)$$

$$P_{\rm SL} = \frac{1}{3V} \sum_{i=1}^{N_{\rm SL}^c} f_{\alpha i}^{\rm SL} \ell_{\alpha i}^{\rm SL}. \tag{B7}$$

Therefore $P_{\rm L} = P_{\rm LL} + P_{\rm LS}$ and $P_{\rm S} = P_{\rm SS} + P_{\rm SL}$. Since $P_{\rm LS} = P_{\rm SL}$, a factor of 1/2 in Eqs. (B2) and (B3) has to be used to avoid an overestimation of the total pressure, since the mixed contacts are counted twice. $P_{\rm LS} = P_{\rm SL}$ is obtained because the normal branch vector length is defined between particle centers, making no distinction between particle sizes, i.e., $\ell^{\rm LS} = \ell^{\rm SL}$. Alternatively, if the branch vector length were defined using the distance from the center of each particle *i* to its contact location, at a distance radius minus overlap/2 [27], then $P_{\rm LS} \neq P_{\rm SL}$, since $r_{\rm L} \neq r_{\rm S}$; see Refs. [43,44] for the method applied here and the alternative, respectively. Discussing the differences between the two stress definitions is beyond the scope of this paper and thus postponed to future studies.

Figures 14(a)–14(d) show the values of the partial pressures calculated using the expressions given in Eqs. (B4)–(B7). For $\delta = 0.15$ and $X_S = 0.1$, large particles first jam at $\phi \approx 0.71$, then mixed contacts do so (smoothly) at $\phi \approx 0.75$, and later small particles jam at $\phi \approx 0.87$. Figures 14(e)–14(h) show the partial bulk modulus extracted by the fitting method defined in Appendix C. One can see that K_{LL} and K_{SS} exhibit a jump, whereas K_{LS} increases smoothly, see Fig. 14(e). This demonstrates that the LS-SL contact network does not experience a sharp transition whereas the SS contacts do. In fact, K_{LS} dominates the bulk modulus in K_S observed in Fig. 11(a), thus hiding the jump in K_{SS} .

APPENDIX C: FITTING PARAMETERS FOR THE PRESSURE

A power law of the form $P = P_0(\phi - \phi_J)^a$ is used to fit the dimensionless pressure data of each bidisperse packing and study the variation of the fitting parameters with the fitting range of volume fractions ϕ to find the range or regime where the parameters are least dependent on the fitting details, like the number of points, *n*. The fitting begins using the first three points of the data, n = 3, starting around slightly above ϕ_J , until a maximum, which is varied point by point following $\phi_{\text{max}} = \phi_J + n\Delta\phi$, with $\Delta\phi \approx 10^{-3}$. The fit begins with three points, since in the least-squares method the number of data points *n* must be equal to or higher than the number of fitting parameters, in our case m = 3, to find a solution. For each fit we extract the values of the fitting parameters as a function of ϕ_{max} .

Figures 15 and 16 show the fits of the total and partial pressures and the variation of the fitting parameters a, ϕ_J , and P_0 as functions of the fit range, i.e., number of data points n. For $\delta = 0.41$, the fitting parameters, especially a and ϕ_J , do not change too much, almost consistently for the different species. While a does increase a little with n, for lower X_S the parameter a_S turns out to be different, i.e., sensible to the fitting range, see Fig. 15(e). The parameter P_0 is significantly



FIG. 14. (a)–(d) P_{LL} , P_{SS} , and P_{LS} as a function of ϕ for the same δ and X_S shown in Fig. 10. (e)–(h) K_{LL} , K_{SS} , and K_{LS} as a function of ϕ for the same values shown in Fig. 11. The arrow indicates the second transition, $\phi_J \approx 0.87$, extracted by the derivative of n_S , see Fig. 3.

different between total pressure and the different species, see Figs. 15(g) and 15(h).

For $\delta = 0.15$, *a* and ϕ_J do not show a significant variation for higher X_S . However, a_S is quite sensitive to the fitting range at low X_S , see Fig. 16. We think that such variations are due to the high overlaps developed during compression, strongly affecting the power-law exponent. Most of the fitting parameters of P_L are rather insensitive to the fitting range and thus the fitting range for P_L is arbitrary. For P_S the situation is quite different: The parameters are quite sensitive to the fitting range at low δ and low X_S . Therefore a special assumption is considered for the fitting range, i.e., we fit the data of P_S , at low δ and low X_S , with a narrow fitting range near to ϕ_J , keeping $a_S \sim a_L$ as closely as possible. This guarantees low overlaps for small particles and similar power-law exponents for both large and small particles. The fitting parameters extracted from P_L and P_S are used to determine the bulk modulus



FIG. 15. Total and partial pressures for size ratio $\delta = 0.41$ with $X_{\rm S} = 0.1$ (a) and $X_{\rm S} = 0.4$ (b); the corresponding fits are given by $P = P_0(\phi - \phi_J)^a$, with (c)–(h) fitting parameters (ϕ_J, a, P_0) as functions of $\phi_{\rm max}$ (where 50 points is the whole regime $\phi \in [\phi_J : \phi_{\rm max} = 0.82]$.) The lines in (c) and (d) represent ϕ_J shown in Fig. 5. The lines in (e) and (f) represent $a_{\rm Mono} = 1.25$, slightly different from the value $a \sim 1.1$ in Ref. [4]. The solid symbols correspond to the values of the parameters obtained by the fits given in (a) and (b), respectively.

of large and small particles, using $K = \phi P_0 a (\phi - \phi_J)^{a-1}$, in Sec. IV.

APPENDIX D: LINEAR RELATION BETWEEN PRESSURE P AND OVERLAP $\langle \alpha \rangle$

In this Appendix we demonstrate that the dimensionless partial pressures, $P_{ij} = 2r'_L P'_{ij}/\kappa'_n$, depend linearly on the dimensionless mean overlap, $\langle \alpha_{ij} \rangle = \langle \alpha'_{ij} \rangle/2r'_L$, where $i, j \in [L,S]$. This is shown in Fig. 17 for the same values of δ and X_S as in Figs. 14(a)–14(d).

The ranges of pressures and mean overlaps depend on the contact types. Each contact type experiences different overlaps at different pressures, evidencing the different roles each contact type has inside the force network. To understand why pressure is linear with overlap, one can write $P_{LL} = 2P'_{LL}r'_{L}/\kappa'_{n} \approx (Z_{LL}/3V') 4F'_{LL}r'_{L}/\kappa'_{n} =$ $(4/3)Z_{LL}\langle\alpha'_{LL}\rangle/r'_{L} \propto Z_{LL}\langle\alpha_{LL}\rangle$, using $V' \approx r_{L}^{3'}$ and $F'_{ij} =$ $\kappa'_{n}\langle\alpha'_{ij}\rangle$. Using similar reasoning, we find $P_{SS} \propto Z_{SS}\langle\alpha_{SS}\rangle\delta$ and $P_{LS} \propto Z_{LS}\langle\alpha_{LS}\rangle(1 + \delta)/2$ due to the branch vectors $\ell'_{ij} = r'_{i} +$ r'_{j} . The trend lines in Fig. 17 quantify the different slopes that are due to the different partial mean contact numbers Z, the different mean overlaps, and the different branch vectors. For $X_{S} = 0.1$, the large and the mix contribution is dominating,





FIG. 16. Total and partial pressures for size ratio $\delta = 0.15$ with $X_{\rm S} = 0.1$ (a) and $X_{\rm S} = 0.4$ (b); the other figures and symbols are as in Fig. 15. Note the different number of points, due to the maximum (left, $\phi_{\rm max} = 0.95$) and minimum (right, $\phi_{\rm max} = 0.82$).

the small particles contributing little for $\delta = 0.41$ and only a bit for $\delta = 0.15$. In contrast, for $X_S = 0.4$, the small and the mix contribution is dominating, the large particles hardly contributing for $\delta = 0.15$ and only a little for $\delta = 0.41$.



FIG. 17. The partial dimensionless pressures $P = P_{ij}$ as functions of the dimensionless mean overlap $\langle \alpha \rangle = \langle \alpha_{ij} \rangle$ for different δ and X_S values. Note the different horizontal axis ranges for different δ .

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