Jamming and geometry of two-dimensional foams

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Abstract – We experimentally probe the vicinity of the jamming point \(J\), located at a density \(\phi\) corresponding to random close packing \((\phi_{rcp} = 0.842)\), in two dimensional, bidisperse packings of foam bubbles. We vary the density of the foam layer and extract geometrical measures by image analysis. We confirm the predicted scaling of the average contact number \(Z\) with \(\phi\) and compare the distribution of local contact numbers to a simple model. We further establish that the distribution of areas \(p(A)\) strongly depends on \(\phi\). Finally, we find that the distribution of contact forces \(p(f)\) systematically varies with density.

Since the seminal work by Bolton and Weaire [1] soft frictionless discs or spheres have become the Ising model for the Jamming transition [2–4]. Jamming is believed to capture the transition between flow and arrest in a wide variety of disordered media such as foams, emulsions, granular media and (colloidal) suspensions, and this idea has lead to an upsurge of simulations revealing critical behaviour as a function of the distance to the critical point \(J\), which is reached precisely when the applied pressure vanishes [3,5,6]. While some of these predictions have been tested experimentally [7–10], many others still await experimental verification.

While the original incarnation of the soft sphere model explicitly makes the link to foams [2], this connection has not been explored in recent times. Nevertheless, foam bubbles, as well as emulsion droplets are the closest physical analogue of frictionless spheres. Their elastic interaction is close to that of a linear spring [11,12] and solid friction is absent. Under flow, only a velocity dependent viscous friction, that is now fairly well understood [5,6,13,14] acts on the bubbles.

In this letter we experimentally probe the behaviour of jammed packings near point \(J\). We do this by generating two-dimensional packings of foam bubbles. We vary the packing fraction, \(\phi\), and for each density generate many distinct static packings of foam bubbles. We then extract various statistical and topological quantities through image analysis and investigate whether these measures signal an approach of the jamming transition at \(\phi_c\) as the density is varied.

First, we investigate the scaling of the average contact number per bubble \(Z\) with the distance to \(\phi_c\). Our central result is that the contact number scales like \(Z - Z_c \sim (\phi - \phi_c)^{0.5}\). To this end, we first resolve the apparent discrepancy between our findings and simulations by pointing out the differing ways of measuring \(\phi\) between simulation and experiment. We find \(\phi_c\) to be located around \(\phi_c = 0.84\), in excellent agreement with previous predictions [1,3,5,15], and obtain, for the first time, a quantitative experimental confirmation of critical scaling at point \(J\) in an appropriate experimental system.

Besides this global measure, we also investigate the distribution of contact numbers at the bubble scale as a function of global \(Z\). We compare to a recent model [16] and find excellent agreement with previous predictions [1,3,5,15], and obtain, for the first time, a quantitative experimental confirmation of critical scaling at point \(J\) in an appropriate experimental system.

The distribution of free available area per bubble, \(p(A)\) plays an important role in statistical mechanics descriptions of jammed matter [17–19]. We show that the correct way of extracting \(p(A)\) is by tessellating the foam packing with the navigation map [20,21]. We fit the obtained distributions of free area per bubble to gamma distributions [18,22], and show that, in contrast to granular packs, this distribution is far from universal: as we decrease the packing fraction \(\phi\) towards point \(J\), we find an excess of large available areas, and in conjunction with this an increase of the compactivity.
Fig. 1: (Color online) Top (a) and side (b) view of the setup. (a) Bubbles are contained in a circular reservoir and covered by a glass plate. Images are taken in the highlighted area. (b) A stepper motor drives a rod that stirs the bulk solution, thereby rearranging the packing. (c) From left to right: raw image, raw image with reconstructed bubble areas, reconstructed bubble areas, from which \( \phi \) is calculated, and contact network, from which \( Z \) is found. The scale bar denotes 5 mm.

Finally, our navigation map tiling allows us to extract the deformed interfaces between adjacent bubbles. These facets are proportional to the contact forces, and we thus extract the distribution of the contact forces \( p(f) \). We find that its tail is close to exponential for \( \phi \) close to \( \phi_c \), and becomes steeper for large \( \phi \) [23].

**Setup.** – We prepare a surfactant solution consisting of 0.5% volume fraction Dawn dishwashing liquid and 15% glycerol in demineralized water (viscosity \( \eta = 1.8 \pm 0.1 \text{ mPa} \cdot \text{s} \) and surface tension \( \sigma = 28 \pm 1 \text{ mN/m} \)) in a large circular reservoir (\( r = 190 \text{ mm} \)) of depth 30 mm, see fig. 1(a). A bidisperse (50:50 number ratio) bubble monolayer is produced by flowing nitrogen through two syringe needles immersed at fixed depth in the soapy solution. The resulting bubbles of 1.8 ± 0.1 and 2.7 ± 0.1 mm diameter (as determined from experimental images) are gently mixed to produce a disordered bidisperse monolayer and are covered with a 10 mm thick glass plate, see fig. 1(a). The weighted average bubble diameter (\( d \)) is 2.25 mm. We light the bubbles slanted from below and cover the bottom of the reservoir with a black plate, to enhance contrast.

The bubbles contact the top plate, see fig. 1(b), which is completely wetted by the soap solution, and the liquid fraction of the foam can be varied by varying the distance between glass plate and liquid surface between 3 and 0.2 mm. This in itself is not a proper measure of \( \phi \) since the relation between \( \phi \) and the gap is strongly hysteretic — \( \phi \) depends not only on the gap, but also on an uncontrolled confining pressure. Therefore, we will determine \( \phi \) from experimental images, in a procedure outlined below, see fig. 1(c). We check that coalescence, segregation and coarsening are negligible.

**Experimental protocol.** – A stepper motor is glued to the glass plate and is connected to an aluminum rod through a hole in the glass plate, see fig. 1(b). We agitate the surfactant solution underneath the bubbles by driving the rod back and forth with an amplitude of 1 radian, its angular velocity alternating between +0.6 and −0.6 radians per second. We emphasize that while agitating the bulk solution leads to strong mixing of the packing, we inject little enough energy to avoid bubble break-off, as evidenced by the absence of satellites. After 4 oscillations we stop the motor, after which the packings slowly relax to a mechanically stable state. We probe the relaxation of packings at varying \( \phi \) to determine the waiting time between agitation and image acquisition. To this end, we record sequences of images with a CCD camera and measure the variance of the intensity fluctuations of all pixels in difference images.

After waiting for this time, which is of the order of minutes, we record one image in the previously agitated region with a 6 megapixel photocamera (Canon 20D). The image contains between 350 and 700 bubbles, depending on the packing fraction \( \phi \). For various fixed gaps between liquid surface and glass plate we repeat this procedure 100 times and thus obtain 100 packings at roughly equal packing fraction. We visually inspect the resulting packings to be distinct in appearance, and it is these images that we analyse in the following.

**Determining \( \phi \).** – We extract our crucial control parameter \( \phi \) from the experimental images by advanced image analysis, see fig. 1(c): we first binarize the image, after which both the bubble centers and the interstices appear bright. We then remove the interstices by morphological operations and dilate the remaining bubble centers. We then add up a negative of the original binary image to arrive at the final image, in which the bubbles are represented by bright discs against a black background. From this image we can readily calculate the area fraction \( \phi \). Note that, in principle, the concept of packing fraction is problematic for a monolayer of three-dimensional bubbles. We choose our lighting of the bubbles such that the contacts between adjacent bubbles are optimally resolved.

In other words, we image a slice from the packing where the bubbles are the broadest and calculate a 2D packing fraction from this slice.

**Scaling of \( Z \) with \( \Delta \phi \).** – We first determine the scaling of the average contact number \( Z \) with \( \phi \). To determine \( Z \), we locate the center of mass of each bubble in the image, and after Delaunay triangulation and a subsequent removal of bond vectors for non-touching bubbles, we obtain the contact network of the bubbles in the image, from which we calculate \( Z \), see fig. 1(c).

Our results are presented fig. 2, where we plot the values for each distinct packing (grey dots), the average over all 100 images for each packing fraction (black circles) as well as a power law fit of the form \( Z = 4 + Z_0(\phi - \phi_c)^\beta \) (red solid line), where 4 is the contact number at isostaticity. The best fit gives us \( Z_0 = 4.02 \pm 0.20, \phi_c = 0.842 \pm 0.002 \) and \( \beta = 0.50 \pm 0.02 \), in remarkable agreement with theoretical predictions by O’Hern et al. and Durian [2, 3] who found \( Z_0 = 3.6 \pm 0.5, \phi_c = 0.841 \pm 0.002 \) and \( \beta = 0.49 \pm 0.03 \).
Note, however, that the range of packing fractions we can scan over, extends to a surprisingly large value of $\phi = 1.06$. This is due to a striking discrepancy between the manner in which $\phi$ is calculated in simulations and in experiments. In simulations, the area or volume of spheres is fixed, and if one knows the number of particles in the periodic box, $\phi$ is readily calculated. In experiments, however, $\phi$ can only be inferred from experimental images. This difference results in the following: if particles overlap, the overlapping area of the two particles is counted twice in simulations, while it is only counted once in our experiment. This doubly counted area scales with the overlap $\xi$ as $A_{\text{ov}} \sim \xi^{3/2}$, which stems from the fact that the deformed area scales as $r_{\text{c}} \times \xi \propto \sqrt{\xi} \times \xi$. Since $\xi \sim (\phi - \phi_c)$ [4], the conversion between a packing fraction extracted from a simulation $\phi_{\text{th}}$ and its experimentally accessible counterpart $\phi_{\text{exp}}$ should read:

$$
\phi_{\text{exp}} = \phi_{\text{th}} - C(\phi_{\text{th}} - \phi_c)^{3/2}.
$$

We calculate both $\phi_{\text{exp}}$ and $\phi_{\text{th}}$ from numerically generated packings, and determine the pre-factor $C = 0.95$. We then invert eq. (1) and calculate the $\phi_{\text{th}}$ corresponding to our $\phi_{\text{exp}}$.

When plotting our data against $\phi_{\text{th}}$ as in fig. 2, we excellently match simulations, while we find an apparent scaling exponent $\beta = 0.70$ if we plot $Z$ as a function of the experimentally determined $\phi_{\text{exp}}$, see lower inset of fig. 2, owing to the non-trivial relation in $\Delta \phi$ between $\phi_{\text{th}}$ and $\phi_{\text{exp}}$.

We are not the first to experimentally investigate the scaling of $Z$ with $\phi$. Majmudar et al. [9] have extracted the same quantities from images of two-dimensional, frictional, photoelastic discs and compared these to predictions from simulations. From their data it appears the prefactor $Z_0 \approx 16$, inconsistent with simulations. Our results do allow for a direct comparison with frictionless jamming predictions, which can be seen from the excellent agreement between parameters.

**Local contact fractions.** Besides the average contact number per packing $Z$ we can also extract the fraction $x_i$ of bubbles in each image that has $i$ contacts. We average these fractions over all images that correspond to a global packing fraction (and contact number $Z$) cf. the black circles in fig. 2. We plot these fractions versus the average $Z$ in fig. 3: we see clear trends in the abundance of contacts at the particle level, to which we apply a very recent model [16].

This model predicts the fractions of 4 species $\{x_i, \ldots, x_{n+3}\}$ in a packing, given the global $Z$ and the variance $\sigma^2 = \sum_{i=1}^{n+3} x_i (Z - i)^2$. This constraint, together with the trivial normalization constraints $\sum_{i=1}^{n+3} x_i = 1$, $\sum_{i=1}^{n+3} i x_i = Z$ and the ill-understood, but empirically observed constraint that the number of particles with odd and even contacts is equal, leads to a set of of equations, the solution of which is:

$$
x_n = \frac{(Z - (n + 2))^2 + \sigma^2 - 1/2}{4},
$$

$$
x_{n+1} = \frac{-(Z - (n + 1))^2 - \sigma^2 + 5/2}{4},
$$

$$
x_{n+2} = \frac{-(Z - (n + 2))^2 - \sigma^2 + 5/2}{4},
$$

$$
x_{n+3} = \frac{(Z - (n + 1))^2 + \sigma^2 - 1/2}{4}.
$$

Since we know $Z$ and $\sigma^2 (= 0.75)$ from the data we can obtain the fractions $x_i$ without any free parameters. However, we measure non-negligible fractions of not 4, but 5 species. We therefore apply the model for $n = 3$ to $4 < Z < 4.75$, where $x_7 \approx 0$ and for $n = 4$ to $4.79 < Z < 6$

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1Both in [16] and this work.
where $x_3 \approx 0$. We obtain good agreement between data and theory, see fig. 3, for both ranges of validity. At high $Z$, the bidisperse nature of our packing is visible: we observe an excess of both particles with 5 contacts and with 7, while particles with 6 contacts are underrepresented. We have observed that large bubbles carry the majority of 7’s, while small bubbles mostly have 5 contacts at these values of $Z$ (data not shown). This is natural in bidisperse packings, as this occurs whenever a large and a small bubble contact. It thus indicates an absence of crystalline order, which would lead to an increase of 6’s.

The thermodynamical description of granular materials, as introduced by Edwards and Oakeshott [28] translates the concepts underpinning equilibrium thermodynamics to conglomerates of a-thermal particles such as bubbles. The volume $V$ (in 2D the area $A$) takes on the role of energy, while a compactivity $\chi$ replaces temperature.

Aste and Di Matteo have derived the form of the distribution function $p(A,k)$ with such an approach [18]:

$$p(A,k) = \frac{k^k}{\Gamma(k-1)} \frac{(A - A_{\text{min}})^{k-1}}{\langle A \rangle - A_{\text{min}}} \exp \left( -k \frac{A - A_{\text{min}}}{\langle A \rangle - A_{\text{min}}} \right),$$

(6)

with $k$ a shape parameter —which has been found to take on one universal value in granular packings, namely $k = 12$ [24], $A_{\text{min}}$ the minimum available area per bubble and $\langle A \rangle$ the mean. The compactivity is defined as $\chi = (\langle A \rangle - A_{\text{min}})/k$ [18]. Note that when $a \equiv k$, $b \equiv 1/\chi$, eq. (6) reduces to a simple two-parameter Gamma distribution in $\tilde{A} = A - A_{\text{min}}$: $p(\tilde{A}) = \frac{b^a}{\Gamma(a)} \tilde{A}^{a-1} \exp(-b\tilde{A})$.

Here we extract $p(A)$ from our experimental images for each packing fraction both from a Voronoi and a navigation map tesselation. We calculate the Voronoi area distribution of the grid of points that represent the centers of mass of the bubbles. Note that Voronoi cell edges do in general not respect the bubble perimeter, see fig. 4(a) and
that thus, the Voronoi cells do not represent the free area per bubble. For hard spherical objects one can get around this problem [19], however, in our experiment, the bubbles are not only bidisperse, but in general also deformed and the flattened contacts can be curved.

To fully take the effects of both deformations and bidispersity into account, we calculate what is called the navigation map [20,21]. In this method, we assign pixels in the voids between bubbles to those bubbles whose perimeter is closest. The result is shown in fig. 4(b): we obtain free areas per bubble that respect the bubble edges and follow the curvature of the contacts.

With both methods we obtain bimodal distributions for $A$, which we split according to the size of the bubbles. Distributions for the larger bubbles are shown in figs. 4(c), (d) for Voronoi and navigation map tesselations respectively. Distributions for the smaller bubbles behave the same. For the Voronoi tesselation we find that the shape of the distributions is roughly independent of the packing fraction, with all distributions being slightly skewed (see inset of fig. 4(c)), while for the navigation map tesselation we find that an excess of large available area develops near jamming, leading to strongly asymmetric distributions.

We quantify these observations by fitting eq. (6) to our experimental distributions. We treat $k$ as a fit parameter and extract $A_{\text{min}}$ from the data: it is the minimal hexagon that can enclose a bubble at a given packing fraction. Results are plotted in figs. 4(e), (f): the nearly constant shape of the Voronoi distribution is reflected by the near constant value of $k$ we extract, with $(k) = 13.1$ for large bubbles and $(k) = 11.4$ for small bubbles when averaged over all values of $\phi$.

However, for the navigation map distributions we observe a systematic trend in $k$ with $\phi$. The nearly Gaussian distributions at high $\phi$ can be fit when $k \sim 50$, but $k$ systematically decreases with decreasing packing fraction $\phi$ to a value of 6 near jamming. This strong variation reflects the increasing amount of excess available area per bubble with decreasing packing fraction, which is also reflected by an increasing compactivity $\chi$, see inset of fig. 4(f). Since the navigation map tesselation respects bubble edges, we believe this tesselation to be more physically appropriate, and we see the decrease of $k$ and the associated broadening of the tail of $p(A)$ as a signature of the approach of point $J$, or, equivalently, the recovery of hard-sphere behaviour as the value of $k$ approaches that of two-dimensional hard disc packings, where $k \sim 3.7$ [19,26].

**The force distribution $p(f)$.** — By construction, the navigation map bisects touching bubbles at their contact area. As a result, we can extract the radius $r_c$ of the deformed contacts between bubbles. Since the contact force $f_{12}$ between two bubbles is linear in the deformation, it is related to $r_c$ as [29]

$$f_{12} = \pi r_c^2 \left( \frac{R_1 + R_2}{R_1 R_2} \right)$$

with $R_i$ the radius of bubble $i$. We can thus extract the force distribution $p(f)$ of interbubble contact forces. An experimental image with the contacting facets in white and the extracted contact forces in blue is shown in fig. 5(a).

The forces are oriented along the bond vector between bubbles and thus we can check if the forces balance on each bubble. To check this, we plot the relative error $\sum f / \sum ||f||$ in fig. 5(a). We see that the error is about 10% for the densest packings, and increases for packings that are closer to jamming.

In fig. 5(b) we plot, for various $\phi$, the $p(f)$ of all forces from all images at that packing fraction. We convert $r_c$ to forces using the blob radii $R_i$ we obtain after binarizing and removing the interstices. These radii are proportional to, but smaller than the actual bubble radii. We therefore plot the force distributions in arbitrary units. The distributions are peaked and exhibit broad tails, reflecting the heterogeneity in the forces. Their shapes are similar to those found in grains and emulsions [29,30],
In the inset of fig. 5(b) that the peak of the distribution shifts towards lower forces as we approach point J, in accordance with [31].

To obtain more information on the shape of the tail of $p(f)$, we now rescale each $p(f)$ from an individual image by its mean and average these distributions for each $\phi$. Just adding up the force distributions for each frame, as was done for fig. 5(b), washes out any signature of Gaussian tails [31]. The result is shown in fig. 5(c): we now observe changes in the shape of the tail away from jamming —with increasing compression the decay of the tail seems to become steeper than exponential. This is illustrated by the inset of fig. 5(c), where we plot $\ln(p(f))/f$ which tends to a constant for exponential tails and decreases for faster than exponential decay. We thus provide further evidence that one can find steeper than exponential decay in $p(f)$, although we do not have sufficient statistics to conclude that the tails cross over to Gaussian tails away from jamming. Note that a similar behaviour is seen in simulation and experiments on emulsions [29].

Conclusion. – We have experimentally investigated the behavior of soft frictionless discs near the jamming point at zero stress and temperature, by sampling distinct packings of foam bubbles at varying packing fraction $\phi$. We have, for the first time, quantitatively confirmed critical scaling in the contact number $Z$ and we have extracted local contact numbers and compared these to a simple model. We have found a strong variation in the shape of the area distribution $p(A)$ as we approached the jamming point, signalling an increase in compactness, as well as as a crossover from steeper-than-exponential to exponential tails in the force distribution $p(f)$, as was earlier observed in emulsions. These results should help to discern between competing theories for jammed matter.

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