## **Elasticity in Amorphous Solids: Nonlinear or Piecewise Linear?**

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Quasistatic strain-controlled measurements of stress versus strain curves in macroscopic amorphous solids result in a nonlinear-looking curve that ends up either in mechanical collapse or in a steady state with fluctuations around a mean stress that remains constant with increasing strain. It is therefore very tempting to fit a nonlinear expansion of the stress in powers of the strain. We argue here that at low temperatures the meaning of such an expansion needs to be reconsidered. We point out the enormous difference between quenched and annealed averages of the stress versus strain curves and propose that a useful description of the mechanical response is given by a stress (or strain) -dependent shear modulus for which a theoretical evaluation exists. The elastic response is piecewise linear rather than nonlinear.

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Materials designated as "amorphous solids" span a large class of noncrystalline materials that exhibit an elastic response to small strains or stresses. In this class, one finds "tough" materials like metallic glasses as well as "soft" materials like foams, with many intermediate (in strength) materials in between. All this host of materials display initially a linear response to a quasistatic external loading (strain  $\gamma_{ij}$  or stress  $\sigma_{ij}$ ) with a shear modulus that relates the stress to the strain. Omitting tensor indices for notational simplicity, one writes

$$\sigma = \mu \gamma, \qquad \gamma \ll 1, \tag{1}$$

with  $\mu$  being the shear modulus.

Upon the increase in the external loading, this linear relation appears to fail. The response of the amorphous solid begins to mix elastic intervals interspersed with plastic events [1–6], leading generically to an apparent nonlinear dependence of the stress as a function of the strain; see Fig. 1 as an example. The stress versus strain curves for large values of the strain either end abruptly due to a catastrophic failure of the material or display a regime of "steady state" where the shear modulus  $\mu$  appears to vanish. Viewing stress versus strain curves of this type, one is tempted to present them before the onset of the steady state as a nonlinear expansion, referred to as "nonlinear elasticity," in the form (again with tensor indices omitted)

$$\sigma = \mu(\gamma = 0)\gamma + B_2(\gamma = 0)\gamma^2 + B_3(\gamma = 0)\gamma^3 + \dots$$
 (2)

The aim of this Letter is to discuss the validity of such expansions for generic amorphous solids at low temperatures and, in fact, to argue that they should be carefully reconsidered. The discussion will also make clear what we mean by "low temperatures."

It is already known that at zero temperature T = 0 the nonlinear coefficients in Eq. (2) do not exist in the thermodynamic limit [7]. The issue raised here is what

the nature is of the elastic response of amorphous solids at finite temperatures. We will show that, in fact, one should consider the elastic response of amorphous solids between plastic events, and there one can invariably define a "piecewise linear" elastic response in the form

$$\Delta \sigma = \mu(\gamma) \Delta \gamma$$
, for any value of  $\sigma$  and  $\gamma$ , (3)

with  $\mu(\gamma)$  determined theoretically; cf. Eq. (4) below. We should stress that this piecewise linear law is also valid in the steady state regime with a finite shear modulus in spite of the apparent flat dependence of the stress on the strain. The difference between the approach of Eq. (2) and the proposition Eq. (3) requires a discussion of the difference between quenched and annealed averages. A quenched



FIG. 1. Typical stress versus strain curves obtained from molecular simulations using a two-dimensional Kob-Andersen glass former with a 65:35 ratio of 1000 point particles having Lennard-Jones interaction with longer and shorter interaction lengths. The curves shown are obtained by averaging 100 individual stress versus strain curves obtained from 100 realizations of the initially prepared glass. The temperatures shown are in Lennard-Jones units as explained in the text. Customarily, one fits a nonlinear expansion like Eq. (2) to such curves. We argue in this Letter that such nonlinear expansions are not tenable.

average of the shear modulus will be defined below as the result of measuring the slope of a stress versus strain curve in each individual realization of the glass and averaging the result. An annealed average will be defined as averaging stress versus strain curves over many realizations and measuring the local slope.

To establish the proposed "law" Eq. (3), one needs to examine first small systems at sufficiently small temperatures (to be determined below) and learn how to approach the thermodynamic limit. In this Letter, we will use quasistatic strain-controlled protocols with simple shear. The advantage of using small systems and low temperatures is that one can resolve the stretches of strain for which the response of the system is purely elastic, as these are punctuated by intervening plastic events. The discussion below will be exemplified by molecular dynamics simulations at low temperatures. Obviously, in such simulations one deals with systems that are not in thermodynamic equilibrium whose attainment requires astronomical relaxation times. Nevertheless, we will show that by increasing the strain quasistatically we can equilibrate the systems in the restricted sense that between plastic events the average stress and the average energy reach stationary values. We refer to such states as "restricted temperature ensembles" while not in true thermal equilibrium, they nevertheless succumb to thermal statistical mechanics. In other words, we will demonstrate that for our glasses the shear modulus can be computed for any value of the strain by using the thermal expression [8-10]

$$\mu(\gamma) = \mu_B(\gamma) - \frac{V}{k_B T} [\langle \sigma^2 \rangle - \langle \sigma \rangle^2], \qquad (4)$$

where  $\mu_B$  is the usual [11,12] Born approximation for the shear modulus and V and T are the volume and the actual temperature of the glass, respectively.  $k_B$  is Boltzmann's constant. The stress fluctuations are measured as usual in an equilibrated Gibbs ensemble. Below, we will use the notation

$$\mu_F(\gamma) \equiv \frac{V}{k_B T} [\langle \sigma^2 \rangle - \langle \sigma \rangle^2]. \tag{5}$$

Numerical simulations.—To generate data for the present discussion, we perform molecular dynamics simulations using the Kob-Andersen model, in which point particles interact via a Lennard-Jones potential. There are two types of particles A and B, and the parameters of the interaction potentials can be found in Ref. [13]. The system is prepared by first randomizing the particles in a volume V, and then we run molecular dynamics at T = 0.8 in Lennard-Jones units for which the Boltzmann constant  $k_B = 1$ . After equilibration the system is quenched, again using molecular dynamics, to temperature T = 0.001 at a rate of  $\dot{T} = 10^{-6}$ . Simulations are performed at this final temperature until the mean energy of the system stabilizes, exhibiting a time-independent value. Simulations of quasistatic straining are

then performed either at this temperature or at any desired higher temperature which is obtained by heating up the system. After reaching the desired temperature, one waits again for the stabilization of the mean energy. Of course, the time taken for stabilization is much shorter than the glass relaxation time (known as  $\tau_{\alpha}$ ), and the systems considered are *not* in true thermal equilibrium. We will argue, however, that they reach a "restricted" Gibbs ensemble that allows for the definition of meaningful statistical averages.

Once the system has stabilized its mean energy, we strain it quasistatically using simple shear with Lees-Edwards periodic boundary conditions [14]. Strain steps of magnitude  $\delta \gamma = 2 \times 10^{-4}$  are taken, allowing the system to stabilize both its mean energy and mean stress for 10<sup>5</sup> MD steps after every such increase. Stabilization is then obtained when the average energy and the average stress are constant over additional  $2 \times 10^5$  MD steps. Next, the mean stress  $\sigma_{xy}^{\text{int}}$  and the second moment of the stress  $\sigma^2$ are measured for each realization. At this point, we record the mean stress as a function of the strain. Finally, we average the first and second moments of the stress over our different realizations to obtain  $\langle \sigma \rangle$  and  $\langle \sigma^2 \rangle$ . With systems of 1000 particles the stress versus strain curves for every realization reveal different characteristics from the averaged curves shown in Fig. 1. Typical such stress versus strain curves for individual realizations are shown in Fig. 2 at different temperatures. The different realizations show clearly the piecewise linear stretches between plastic events in which the stress drops suddenly. The nature of the plastic events changes before and after the "vield" which is followed by the steady state regime. Before yield, the events are small, and they are known at T = 0 to be represented by individual Eshelby quadrupolar displacement fields that are associated with small energy drops that are system size



FIG. 2. Individual realizations of stress versus strain curves for systems of 1000 particles at different temperatures. Note that individual plots never attain a zero shear modulus between plastic events.

independent. Beyond yield at T = 0, the events are system spanning events in which the energy drops are subextensive [4]. Also at finite temperatures, one sees in Fig. 2 the change from small stress drops to large ones [15]. The highly serrated nature of the stress versus strain curves is masked by the averaging of many realizations shown in Fig. 1, as well as in the thermodynamic limit. For large systems, the density of events increases enormously, as the strain intervals between plastic events decrease rapidly with the system size [16]. Accordingly, we need to examine carefully the elastic response of the system and how to interpret the thermodynamic limit in a meaningful way.

The elastic response and quenched averages.—Denote the sequence of strain increments as  $\Delta \gamma_i$  and the thermally averaged stress measured after the system stabilizes as  $\sigma_i$ . To calculate the shear modulus  $\mu$  from the slope of the thermally averaged stress versus strain, we determine a sequence of values  $\sigma_i$  that satisfies  $\sigma_{i+1} > \sigma_i$  and compute the average slope where now the average is over the sequence. Once we have found a couple of stress values satisfying  $\sigma_{i+1} < \sigma_i$ , we begin a new sequence of increasing stress values and average again the slope for that sequence. We associate the value of this average slope with the mean strain in the sequence. At this point, we introduce the quenched averages. Measuring then the observed value of the slope, we average it over O(100) realizations at the same values of T and in a small bin of  $\gamma$  values and denote the results as  $\mu(\gamma, T)$ . In parallel, for each measured thermally averaged stress, we compute also the stress fluctuations and evaluate the Born approximation directly from the known Hamiltonian of the system. We then compute the expression for the shear modulus as provided by Eq. (4). As before, we average the resulting number over O(100) realizations. The two evaluations of the shear modulus are compared in Fig. 3.



FIG. 3. Comparison of the direct measurement of quenched averages of the shear modulus from the local slope of the strain versus stress curves and the theoretical expression Eq. (4).

This comparison allows us to reach a number of important conclusions. (i) The two evaluations agree. This means that the actual elastic response should be considered piecewise linear rather than resulting from a nonlinear expansion. In no way can one say that the local slope is, say, given by  $\mu(\gamma = 0) + 2B_2\gamma + 3B_3\gamma^2 + \dots$ Throughout the strain range, the stress fluctuations reduce the Born term to predict correctly the local linear response of the system. This includes the steady state regime of the strain-controlled protocol where it is customary to take the shear modulus as zero. (ii) For the higher temperatures, the evaluation of the local slopes should be done with care, since temperature fluctuations begin to introduce "spurious" apparent slopes in the stress versus strain curves. The temperature T = 0.1 is the highest temperature for this particular system for which we can trust the procedure. At higher temperatures, there are too many intervals with  $\sigma_{i+1} < \sigma_i$ ; it becomes too difficult to separate mechanical increases of stress due to strain changes from random temperature fluctuations in the stress. In this sense we are limited to "sufficiently low temperatures."

Annealed averages.-At this point, we need to discuss the meaning of the local slope of the annealed average of the stress versus strain curves that are shown, for example, in Fig. 1. We already mentioned that nonlinear expansions in  $\gamma$  around  $\gamma = 0$  are untenable at T = 0 and probably also at finite but low temperatures. The question is whether the local slope of such curves yields a number that is the same, or close to, our  $\mu(\gamma)$ . The answer is negative as can seen in Fig. 4. It turns out that averaging the stress versus strain curves before computing the local slopes results in a smoother-looking curve which is nevertheless not really differentiable. It is made of individual contributions in which every plastic drop is a singular event where differentiability is lost. Since these events occur at different values of  $\gamma$  for each realization, averaging results in smoother-looking curves, but the local slope of the



FIG. 4. An example of the comparison of annealed and quenched averages of the local slope of the strain versus stress curves and the theoretical expression Eq. (4). This example is at T = 0.01, but the conclusion is identical in all the tested temperatures: Except at  $\gamma = 0$ , the results of the annealed and the quenched averages of the stress versus strain curves differ greatly.



FIG. 5. The annealed stress versus strained curve (continuous black line) and the actual segments of linear response of the various realizations that were annealed to get the continuous line. Except at  $\gamma = 0$ , the annealed procedure does not supply the right information regarding the mechanical response.

resulting annealed average is *not* the shear modulus as computed from its theoretical definition Eq. (4). To make this point crystal clear, we show in Fig. 5 the annealed averaged stress versus strain curve at T = 0.001 and superpose on it the actual realizations that give rise to it by averaging. As said, the discrepancy is most glaring in the steady state regime, but it is equally severe at each value of  $\gamma \neq 0$ .

Finally, we need to discuss the relevance of these findings to the macroscopic experiments in which it is impossible to resolve the tiny stress drops which are extremely dense, resulting in a relatively smooth-looking curve. If we accept the tentative view that such curves are equivalent to our annealed procedure due to self-averaging, then we must conclude that their local slope is not providing a correct measurement of the shear modulus as a function of  $\gamma$ . The discrepancy is, of course, most glaring in the steady state regime, where the annealed protocol results in a vanishing shear modulus. This is clearly incorrect, since the strained-controlled system can support a stress without flowing, meaning that the shear modulus cannot be zero. Here we find the discrepancy occurs already in the so-called "elastic regime." To get a correct measurement of  $\mu(\gamma)$ , one should measure the stress fluctuations and estimate the Born term to compute Eq. (4). This is, of course, not an easy task, but the discussion presented above should provide a warning as to the proper interpretation of the local slopes of macroscopic stress versus stress curves.

*Concluding remarks.*—The main point of this Letter is that in random systems one can expect that quenched and annealed averages might yield different results. This is shown to be particularly true for the shear modulus, which can be computed either for each realization and then averaged or rather from an average of stress versus strain curves. The answer is very different, as can be seen from Fig. 4. The question "which is then the relevant shear modulus" is answered in our opinion by comparing with the theoretical expectation Eq. (4). This theoretical expression is derived for a system in thermal equilibrium. Another result of the present study is that, although quenched glasses are not at true thermal equilibrium, they can be thermalized in the restricted sense that their average energy and stress are stationary. In that situation, the stress fluctuations can be measured, and the theoretical value of the shear modulus is in very good agreement with the quenched rather than the annealed average as described above. We therefore propose that measurements of shear moduli and other mechanical indices that employ annealed or self-averages must be considered with extra care. These may not be the actual indices that are better revealed by either quenched averages or by expressions of the type of Eq. (4).

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