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# Nonaffine motion and network reorganization in entangled polymer networks

Saleh Assadi.<sup>a</sup> Samuel C. Lamont.<sup>a</sup> Nitin Hansoge. <sup>b</sup> Zhuonan Liu.<sup>b</sup> Victor Crespo-Cuevas, Fay Salmon and Franck J. Vernerey \*\*

This paper presents a computational model designed to capture the mechanical behavior of entangled polymer networks, described by dynamic and slideable cross-linking junctions. The model adopts a network-level approach, where the polymer chains between junctions are represented by segments exhibiting entropic elasticity, and the sliding of chains through entanglements is governed by a frictional law. Additionally, the model incorporates stochastic processes for the creation and depletion of entanglement junctions, dynamically coupled with sliding mechanics. This framework enables the exploration of the time-dependent mechanical response of entangled polymers with and without covalent cross-links. We apply this model to study the nonlinear rheology of such networks, linking macroscopic stress-strain behavior to the underlying microscopic events within the network. The approach is computationally efficient, making it a useful tool for understanding how network design influences polymer performance in elasticity, rheology, and general mechanical features. This work provides valuable insights into the relationship between molecular-level interactions and the macroscopic properties of entangled polymer systems, with potential applications in the design and optimization of advanced polymer materials.

#### 1 Introduction

It is now well established that the viscoelastic behavior of polymers depends not only on the response of its constitutive chains but also on the collective intermolecular interactions between them. In particular, above the glass transition temperature, entanglements between chains dominate molecular deformation mechanisms over long timescales.<sup>1</sup> Although they can exhibit complex topologies, entanglements are often conceptualized as transient (or sliding) cross-links, which strongly constrain chain movement at fast loading rates but allow their relaxation and flow over long time scales. The second half of the 20th century has seen major developments in understanding the relation between structure, entanglement, and rheology, notably with the seminal works of Green and Tobolsky,<sup>2</sup> Edwards<sup>3</sup> and de Gennes.4 The effect of entanglements on viscoelasticity and extensive ductility, however, is less understood. Yet, their role is widely acknowledged in industrial applications, a notable example of which is pressure-sensitive adhesives (PSAs) whose design relies on using high molecular weight polymers with low cross-link density for their superior bond strength. These materials display a maximum fracture energy slightly above the

glass transition temperature in a regime where entanglements dominate the deformation.<sup>5</sup> Furthermore, recent evidence shows that a proper ratio of entanglement to covalent crosslinks can yield soft materials with the ability to be highly stretched without being ruptured or damaged<sup>6</sup> since they can redistribute the applied energy and dissipate it.

The critical role of entanglements on macroscopic response is due to their role in mediating the complex, non-affine, and time-dependent motion of polymer chains within a network. In this context, the term "network" does not denote the presence of covalent bonds but rather refers to an assembly of polymer chains (the segments) that are entangled at discrete junctions (the nodes). At the molecular scale, this phenomenon is characterized by the snake-like sliding of chains through a transient tube formed by surrounding chains, 4 which leads to a nonlinear and dynamic response to external forces. As chains reptate, the local load-sharing mechanisms within the network evolve, causing a shift from initial, relatively homogeneous load distribution to a more complex, temporally variable pattern. Thus, a chain in a fully entangled network may initially deform with the surrounding medium but will eventually relax by reptation. Collectively, this not only yields network-level stress relaxation but also dissipates the localized tension in chains over time, such that chain rupture events may completely disappear at low strain rates.7 In addition to reptation, localized events such as entanglements and disentanglements

<sup>&</sup>lt;sup>a</sup> Paul M. Rady Department of Mechanical Engineering, University of Colorado, Boulder, USA, E-mail: franck.vernerev@colorado.edu

<sup>&</sup>lt;sup>b</sup> Corporate Research Lab, 3M Company, St. Paul, USA

can introduce further local stress concentrations but also play a crucial role in the permanent reorganization of the network structure. As this reorganization is the source of permanent (plastic) strains<sup>8</sup> that are undesirable in most structural applications (for instance in PSAs), a small number of covalent crosslinks are often added to the network. In this case, cross-linking points can preserve the long-term elasticity of the polymer<sup>6</sup> while relaxation from reptation dynamics can delay damage initiation. 10 It is therefore not surprising that materials with a high concentration of entanglements benefit from fracture resistance and rate-dependent energy dissipation. 11,12 The interactions between entanglement dynamics and the force transfer at covalent junctions is however poorly understood<sup>6</sup> and constitutes a motivation for this work.

Although the mechanisms behind reptative relaxation and delocalization may be intuitive, developing theoretical models to describe their effects on stress re-distribution and molecular structure is a challenging task. Perhaps one main reason for this is that these mechanisms of structural re-organization are inherently non-affine deformation modes. 13-15 In other words, classical models that assume microstructural motion is governed by macroscopic motion do not apply. 16,17 Instead, network conformation is highly sensitive to local load transfer between interacting chains. This calls for modeling strategies based on an accurate representation of network topology and architecture. 18 The most direct way to introduce the details of these effects is by performing molecular dynamics simulations. 19-22 For instance, the work of ref. 20 aimed to study the relaxation and chain retraction of an entangled network after a large step uni-axial deformation by using the bead-spring model pioneered by Kremer and Grest.<sup>21</sup> Coarse-grained molecular dynamics, such as the theoretically informed coarse-grained approach of Ramírez-Hernández et al.,23 have also been used to explore the relaxation spectrum of entangled networks. However, it should be noted that these simulations generally suffer from prohibitive computational costs, limiting their use to small physical domains (1-100 nanometers).

More efficient models, following theoretical concepts such as the tube model and primitive path analysis, were developed with even further coarse-grained descriptions to follow the respective motion of chains and their tubes with Langevintype stochastic equations. 23,24 This was quickly followed by full network models in the early 2000s, particularly with the primitive chain network of Masubuchi et al.25-29 and the slip-link model by Doi and Takimoto.30 In these models, entanglement points are seen as temporally cross-linked junctions (slip-links) about which chains can reptate over time. The creation and deletion of entanglement at the start and end of the tube may then be handled using a Langevin equation. These approaches were mainly used to explore the nonlinear rheology<sup>31</sup> of various types of polymers (linear and star-shaped), with various molecular weights such as the works of de Pablo et al. 32,33 In a more recent work,34 a slip-spring-based mesoscopic simulation was developed in which entanglements are modeled as slip-springs that can hop between Kuhn segments of two chains. These developments on modern mesoscale network models reflect their promising usage for bridging small-scale physics and network motion to better understand the mechanical behavior of polymer materials.35

To further extend mesoscale simulations on entangled systems and more accurately capture strain-induced local topological changes, we propose a discretized framework that reflects physical mechanisms controlled at the individual chain level. Our approach begins with a theoretical description of an idealized network composed of entangled chains (without crosslinks). We then construct a free energy functional and employ energy minimization techniques to derive the governing equations for chain motion and reptation. Subsequently, we establish a diffusion-based model for the creation of entanglements and disentanglements, where the local topology of each chain dictates these events, as opposed to a globally applied rule controlling the number of entanglements per chain.<sup>25</sup> In more detail, we have used the diffusion dynamics of free dangling polymer chains to derive a governing timescale for the hooking processes of dangling ends which are assumed as Poisson processes. Finally, we implement the discretized governing equations within a molecular dynamics framework (using LAMMPS) and conduct a detailed analysis of stress redistribution and network reorganization in entangled networks during a uniaxial stress relaxation test. We illustrate our model to capture non-uniform motion and modes of reptation, resulting in network-scale defects that serve as initiation points for fracture or cavitation.

# 2 Discrete model of entangled networks

As depicted in Fig. 1A, entangled polymer networks are made of long flexible chains whose motion is restricted by entanglement junctions. Near these junctions, the steric hindrance created by the densely packed polymer chains restricts their ability to move freely, as bulky segments of one chain physically block the movement of adjacent chains, limiting the conformational freedom of the polymer segments. This is conceptually illustrated by the tube model, 4,36 in which chains can only slide through the tube-like regions formed by neighboring chains. The crowded environment then makes it more difficult for chains to disentangle or to move past each other, leading to increased frictional interactions and an overall time-dependent mechanical response of the material. This generally includes stress relaxation and a pronounced visco-elastic behavior whose characteristic timescale reflects the difficulty of chain motion in the entangled state. In addition to chain reptation, new entanglements may be formed while existing ones might be lost. These events, denoted here as re-entanglement and disentanglement, respectively, are discussed in more detail below. These events induce topological changes in the network which can create network defects that abruptly change network's mechanical properties.

To capture these coupled phenomena, we here propose a meso-scale approach to model entangled polymer networks.

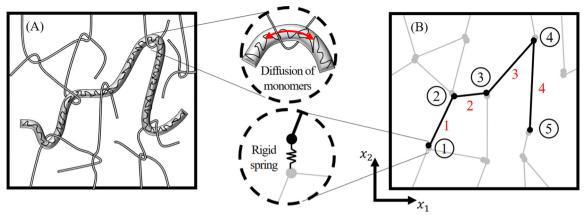


Fig. 1 Physical depiction of an entangled polymeric network. (A) Schematic illustrating the topology of an entangled chain that can reptate in the entanglement tube constrained by mechanical interlock of entanglements. It must be noted that only one chain is highlighted here, and each chain can reptate through its entanglement tube. (B) Discretized depiction of an entangled network where the long chain is discretized to N<sub>subchain</sub> = 4 subchains (dangling ends are not visualized) and 5 entanglements.

The network exists in a two-dimensional region  $\Omega \subset \mathbb{R}^2$  whose dimensions are much greater than the characteristic lengthscale of the polymer chains. We consider that each 'branch' of an entangled chain (i.e., the portion spanning between two entanglements or cross-links) acts as a constrained entropic spring. The constraining network junctions are modeled by two nodes connected by a rigid spring whose centerpoint is located inside the region  $\Omega \in \mathbb{R}^2$  (Fig. 1B). We note that these springs are significantly stiffer than polymer chains and thus exhibit very little deformation. Each node belongs to only one chain, which facilitates tracking chain sliding as pertaining to a unique polymer chain. We may, therefore, divide a single chain into N<sub>subchain</sub> internal load carrying subchains constrained by  $N_{\text{subchain}} + 1$  entanglements with two additional (dangling) end subchains which are only constrained at one end. Within a divided chain, we consider only the internal subchains as storing elastic energy and do not explicitly model the location of the dangling ends. We may then define a numbering scheme that assigns an index  $i \in \{1, 2, ..., N_{\text{subchain}}\}$  to each internal subchain, which is, in turn, constrained by two entanglements with indices i and i + 1, respectively. We may then refer to the dangling ends as subchains 0 and  $N_{\text{subchain}}$  + 1, respectively, noting that their existence is accounted for to describe stochastic dis-entanglement and re-entanglement events. The details regarding chain elasticity, sliding dynamics, and stochastic reentanglement and dis-entanglement are discussed next.

#### 2.1 Elasticity in entangled polymer tubes and resultant junction motion

A network's constitutive properties are inherently tied to the force-extension behavior of its constitutive elements (i.e., the subchains). We here assume that subchains can be modeled as flexible Gaussian chains with a linear force-extension relationship (Fig. 2A). A more realistic model, such as the Langevin chain

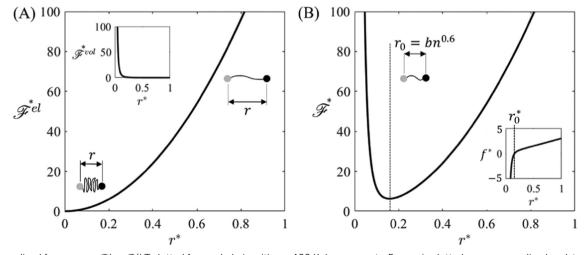


Fig. 2 Normalized free energy  $\mathscr{F}^* = \mathscr{F}/kT$  plotted for a subchain with n=100 Kuhn segments. Energy is plotted versus normalized end-to-end length  $r^* = r/bn$ , where  $r^* = 1$  is the contour length of the subchain. (A) Normalized elastic and volumetric energy contributions plotted versus normalized endto-end length. (B) Normalized total free energy and normalized tension  $f^* = fb/kT$  are plotted, and the resting length  $r_0$  is shown on both plots.

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model,<sup>37</sup> may also be considered to account for the finite extensibility of polymer chains. Moreover, the enthalpic stiffness of the polymer backbone may be incorporated when an energetic damage criterion is desired, 7,38,39 but at the expense of increasing the model complexity. For this reason, we limit our model to moderate chain deformations such that each subchain remains in the linear elastic range (i.e. the end-to-end distance of each subchain is much shorter than its contour length). With the flexible chain model, 40 the entropic elastic free energy  $\mathcal{F}_i^{el}$  of subchain "i" with  $n_i$  Kuhn segments and endto-end vector  $\mathbf{r}_i$  takes the form

$$\mathscr{F}_i^{\text{el}}(\mathbf{r}_i) = \frac{3kT}{2n\cdot h^2} r_i^2,\tag{1}$$

where  $r_i = |\mathbf{r}_i|$ , k is Boltzmann constant, T is the absolute temperature, and b is the Kuhn length. Furthermore, the endto-end vector is written in terms of the position vectors  $x_{i+1}$  and  $x_i$  of the adjacent junctions by  $r_i = x_{i+1} - x_i$ . To further account for volume exclusion forces in the network that originate from the inherent volume of Kuhn segments, the above potential is enriched with a short-range repulsive potential preventing chains from contracting to a single point. 41 This contributes the following volumetric elastic free energy  $\mathcal{F}_{i}^{\text{vol}}$  for subchain i:

$$\mathscr{F}_i^{\text{vol}}(\mathbf{r}_i) = kTb^3 \frac{n_i^2}{r_i^3}.$$
 (2)

Note that while volume exclusion forces classically behave isotropically (similar to pressure), they are here modeled as an effective force between nodes that are connected by a subchain (in a pairwise manner). Consequently, the force  $\partial \mathscr{F}_i^{\text{vol}}/\partial r_i$  is always in line with the end-to-end vector  $r_i$  of the subchain. The total elastic free energy  $\mathcal{F}_i$  of subchain i with  $n_i$ Kuhn segments can be written by combining (eqn (1) and (2)):

$$\mathscr{F}_i = \mathscr{F}_i^{\text{el}} + \mathscr{F}_i^{\text{vol}} = kT\left(\frac{3r_i^2}{2n_ib^2} + \frac{b^3n_i^2}{r_i^3}\right). \tag{3}$$

Fig. 2 plots both free energies versus the normalized end-to-end length  $r^* = r/bn$  of the chain (where bn is the contour length). In this work, we present all numerical results in normalized non-dimensional units to promote generality. Furthermore, we consider lengths in units of the Kuhn length b and energies in units of the thermal energy-scale kT. In practice, this equates to setting kT = b = 1 for obtaining numerical results.

As depicted in Fig. 2A, the chosen energy potential creates a force that repels the two ends of a subchain at a distance that is determined by the chain length (or  $n_i$ ) (Fig. 2B). To calculate this equilibrium point, we minimize  $\mathcal{F}$  with respect to  $r_i$ , yielding  $r_i^0 = b n_i^{0.6}$ , which confirms the dependency of the equilibrium segment end-to-end distance with  $n_i$ . The definition of the free energy further enables us to calculate the tension force  $f_i$  in each subchain by taking the derivative of  $\mathcal{F}_i$  with respect to the end-to-end vector  $\mathbf{r}_i$  as:

$$f_i = \frac{\mathrm{d}\mathscr{F}_i}{\mathrm{d}\mathbf{r}_i} = 3kT \left( \frac{1}{n_i b^2} - \frac{n_i^2 b^3}{r_i^5} \right) \mathbf{r}_i \tag{4}$$

By setting  $f_i = 0$ , we indeed confirm that subchains are tensionfree when  $r_0 = bn_i^{0.6}$  (Fig. 2B). The equation of motion for node ican then be derived using a Langevin equation, previously used by Masubuchi in ref. 25, and omitting the thermal noise term, assumed here to be small. This gives for node with index i

$$\sum \mathbf{f}_i - \mu \dot{\mathbf{x}}_i = m_i \ddot{\mathbf{x}}_i, \tag{5}$$

where  $m_i$  is the mass of node i,  $\sum f_i$  is the sum of the elastic forces acting from connected subchains on the entangled node pair, and  $\mu$  is the viscosity imposed by medium, which resists the motion of an entanglement junction (Fig. 3B). At this molecular length-scale, inertial forces  $m_i\ddot{x}_i$  are typically much smaller than elastic and viscous forces such that the equation of motion can be simplified to

$$\mu \dot{\mathbf{x}}_i = \sum \mathbf{f}_i = \mathbf{f}_i + \mathbf{f}_{i+1} + \mathbf{f}_j + \mathbf{f}_{j+1}, \tag{6}$$

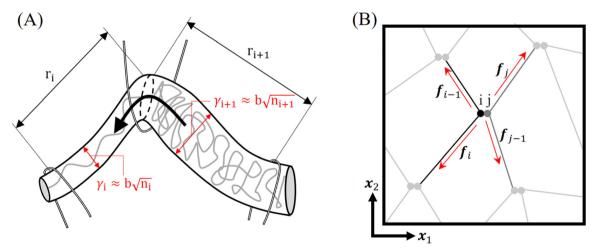


Fig. 3 (A) Schematic representing a chain diffusing through it's entanglement tube from a subchain with higher pressure of Kuhn segments to the neighboring subchain with lower pressure. (B) Discretized representation of an entanglement formed between two chains at junction i - j. The free body diagram shows the forces acting on entanglement pair by the subchains which are attached to them

where  $\sum f_i$  is the sum of the tensions applied by subchains connected to that entanglement, composed of the four subchains depicted in Fig. 3B.

#### 2.2 Viscous chain reptation through entangled junctions

Chain reptation describes the constrained motion of polymer chains within a complex network of entanglements. The reptation model was first introduced by Pierre-Gilles de Gennes<sup>4</sup> based on the snake-like movement of the chains as they navigate through this network, sliding along their length rather than moving freely in three dimensions. In this model, a polymer chain is effectively trapped within an imaginary tube formed by the surrounding entanglements, thereby confining its motion to one dimension. Importantly, the diffusion-like motion of the polymer chain within its confining tube can be described using the same diffusion coefficient as that of a free, unentangled chain predicted by the Rouse model.1 In the present model, this diffusion describes the transfer of monomers from one side of an entanglement junction to the other (Fig. 3A). For this, we introduce the variable  $\dot{\nu}_i$  that measures the rate at which monomers slide through junction i. This variable is related to the rate of change  $\dot{n}_i$  in subchain i by the conservation relation  $\dot{n}_i = \dot{\nu}_{i+1} - \dot{\nu}_i$ .<sup>42</sup>

To calculate the flow of Kuhn segments through each entanglement, we consider minimizing the total free energy  $\sum \mathcal{F}_i$  of the chain. We first define the volume  $V_i^{\text{tube}}$  of the *i*'th segment, which can be estimated by multiplying its area by its length  $r_i$ . Using previous results showing that the diameter of a tube with  $n_i$  Kuhn segments scales with  $b\sqrt{n_i}$ , we can write:

$$V_i^{\text{tube}} \approx \pi r_i \left(\frac{b\sqrt{n_i}}{2}\right)^2 = \frac{\pi}{4} b^2 n_i r_i.$$
 (7)

Next, we consider that each Kuhn segment occupies the same volume  $\mathcal{V}_i$  within a chain. We may then express this volume as

$$\mathscr{V}_i = V_i^{\text{tube}}/n_i = \pi b^2 r_i/4. \tag{8}$$

We therefore find that the volume of a Kuhn segment is directly proportional to the end-to-end vector of a subchain and is independent of the number  $n_i$  of monomers in this segment. Considering reptation as a first-order thermodynamic process, we may then describe the motion of monomers across a junction using the relation

$$\zeta \dot{\nu}_i = \Pi_i - \Pi_{i-1}, \quad \text{where } \Pi_i = \frac{\partial \mathscr{F}_i}{\partial \mathscr{V}_i}.$$
 (9)

In this equation,  $\Pi_i$  can be interpreted as the pressure exerted by the volume  $\mathcal{V}_i$  of the Kuhn segment along subchain i, while  $\zeta$  is the sliding friction coefficient at the sliding junction. Thus, the above equation describes a process where monomers slide along a cross-linking junction from high to low pressure. Equilibrium is reached when all Kuhn segments of each subchain have the same volume  $\mathcal{V}_i$ . This result can finally be used to calculate driving potential  $\Pi_i$  for the flow of Kuhn segments through entanglement via eqn (9):

$$\Pi_{i} = \frac{4}{\pi b^{2}} \frac{\partial \mathcal{F}_{i}}{\partial r_{i}} = \frac{12kT}{\pi b^{2}} \left( \frac{r_{i}}{n_{i}b^{2}} - b^{3} \frac{n_{i}^{2}}{r_{i}^{4}} \right). \tag{10}$$

We note that this pressure quantity is exactly equal to the magnitude of tension (eqn (4)) divided by  $\pi b^2/4$  in each subchain. In other words, the motion of monomers through entanglement junctions is driven by the tension difference between adjacent segments. Interestingly, a similar rule was previously empirically postulated by Masubuchi et al. in ref. 25. However, here we can see that reptation rate of monomers will be slowed down by having larger Kuhn segments.

#### 2.3 Disentanglement and re-entanglement

In contrast to reptation, which describes the motion of chains within an existing network, entanglement/disentanglement dynamics involve changes in the network topology itself. We here describe how each of these mechanisms is accounted for in the network model. A simple study exemplifies each case to illustrate the conditions and implementation of the dynamic entanglement process.

**2.3.1 Disentanglement.** When a polymer chain is stretched, different segments experience varying degrees of elongation, creating a force imbalance across entanglement points. This variation in tension causes the chain to slide through the entanglement until it is completely disentangled. A disentanglement event therefore occurs when a sliding junction is removed, allowing the chains to move more freely. To illustrate how the proposed model captures this mechanism, let us consider a subchain fixed at one end and entangled with another fixed point at its other end (see Fig. 4A). The chain is assumed to initially possess  $n_0$  Kuhn segments. On the other side of the entanglement, the chain possesses a dangling end characterized by  $n_{\rm res}$  Kuhn segments in its initial state. Let us then take the system out of equilibrium by subjecting the inner subchain to a prescribed level of stretch  $\lambda = r/r_0$  at stretch rate  $\dot{\lambda}$ , up to a maximum value  $\lambda_{max}$ . Deformation is ceased afterward (i.e.,  $\lambda = 0$ ) to allow for relaxation. It can easily be shown (see Appendix A) that the dangling chain will eventually slip out of its entanglement point when the maximum stretch is above the critical value  $\lambda_{crit}$  given by:

$$\lambda_{\text{crit}} = \left(\frac{n_{\text{res}}}{n_0} + 1\right)^{0.6}.\tag{11}$$

The model predicts that if the maximum stretch remains below the critical stretch  $\lambda_{crit}$ , the subchain is expected to gradually relax its tension by reptation and stop sliding before a disentanglement occurs (Fig. 4). Conversely, if the stretch exceeds  $\lambda_{crit}$ , disentanglement will occur. With this said, we note that reptation is a rate-dependent process imposed by the friction parameter  $\zeta$ . Thus, the subchain might exceed critical stretch before occurrence of disentanglement or it might disentangle exactly as it is stretched to critical stretch.

To illustrate this point, we consider stretching a chain at a rate  $\dot{\lambda}_{fast}$  faster than sliding and at a rate  $\dot{\lambda}_{slow}$  slower than sliding. Noting that the sliding coefficient  $\zeta$  has units of **Paper** Soft Matter

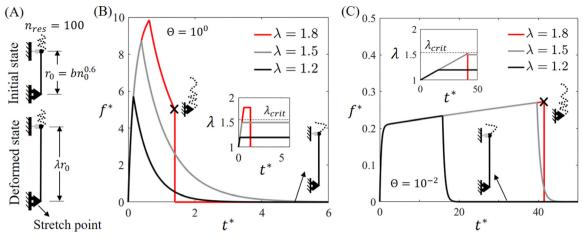


Fig. 4 (A) Schematic displaying a subchain initially at rest with  $n_0 = 100$  Kuhn segments, which is entangled at one end and attached to a reciprocal link at the other end. The neighboring dangling end also has  $n_{\text{res}} = 100$  Kuhn segments. (B) Normalized tension  $f^* = fb/kT$  plotted versus normalized time  $t^* = tkT/\zeta b^3$  for loading at a fast strain rate with respect to sliding  $\dot{\lambda} = (kT/\zeta b^3)$ . (C) Normalized tension  $f^*$  plotted versus normalized time  $t^*$  for loading at a slow strain rate with respect to sliding  $\dot{\lambda} = 0.01(kT/\zeta b^3)$ . In both cases critical stretch is equal to  $\lambda_{\rm crit} = 1.52$ .

viscosity (pressure × time), we may set the sliding timescale,  $\tau = \zeta b^3/kT$  in units of our characteristic length- and energyscales. Then, 'fast' loading rates correspond to  $\dot{\lambda} \geq 1/\tau$  and 'slow' loading rates correspond to  $\dot{\lambda} < 1/\tau$ . With this in mind, we may choose instead to characterize the loading rate by the non-dimensional strain rate number,  $\Theta$ , which is defined as:

$$\Theta = \dot{\lambda}\tau = \frac{\zeta \dot{\lambda}b^3}{kT}.$$
 (12)

With this definition,  $\Theta \geq 1$  corresponds to a fast deformation relative to reptation, and elastic energy will be stored in subchains. In contrast,  $\Theta < 1$  implies a relatively slow deformation such that the system remains close to equilibrium as it is deformed. One might notice that here the size of Kuhn length is also affecting this competition. As is also shown in eqn (10), the larger the Kuhn segments, the slower the rate of sliding. This can be explained by the fact that reptation is fueled by monomer diffusion through entanglement junctions, which occurs at a slower rate for larger Kuhn segments.

In Fig. 4, we consider stretch rates of  $\lambda_{\text{fast}} = 1/\tau$  and  $\lambda_{\text{slow}} =$  $0.01/\tau$ , corresponding to  $\Theta = 1$  and  $\Theta = 0.01$ , respectively. We then consider three maximum stretch values of  $\lambda_{max}$  = 1.2,  $\lambda_{\text{max}}$  = 1.5, and  $\lambda_{\text{max}}$  = 1.8. By looking at tension over time curves (Fig. 4B and C), we see that disentanglement can occur both during or after deformation phase which depends on stretch rate. When the subchain is stretched slowly (Fig. 4C), there is enough time for reptation such that the subchain remains close to equilibrium during deformation. In this condition, disentanglement occurs immediately as the stretch reaches  $\lambda_{crit}$  (sub-plot in Fig. 4C). By contrast, if deformation is imposed rapidly (Fig. 4B), reptation does not have enough time to equilibrate the tension between segments, allowing the chain to temporarily reach a stretch  $\lambda > \lambda_{crit}$  during the deformation phase. The model therefore predicts that disentanglement takes place during relaxation phase under this condition.

2.3.2 Re-entanglement. The creation of new entanglement can arise randomly from the diffusion of chains through space, where they can become intertwined with neighboring chains.<sup>25</sup> This process can be assisted by network deformation, wherein the forced motion of chains causes them to slide past one another and become entangled. Therefore, unlike disentanglement, the creation of new entanglements is a stochastic process that is highly dependent on the local configuration and motion of the chains with respect to their neighbors. In the proposed model, entanglements can only occur between a dangling end and a neighboring subchain (Fig. 5A). An entanglement event is then modeled as an independent stochastic Poisson process with an average rate of  $k_{\text{ent}}$ . We can, therefore, compute the probability of entanglement creation during each discrete timestep of simulation  $(\Delta t)$  as

$$P_{\rm ent} = 1 - e^{-k_{\rm ent}\Delta t}. (13)$$

This exponential probability density function is originally expressed in differential form as  $dP_{ent} = k_{ent}e^{-k_{ent}t}dt$ . By integrating this probability density over the time-span of one discrete timestep  $\Delta t$ , we will find eqn (13). This equation, describes the cumulative probability for creation of an entanglement after one discrete timestep  $\Delta t$ . Let us now seek an equation to relate the number of Kuhn segments  $n_{res}$  in the dangling ends to the rate  $k_{\text{ent}}$  of stochastic re-entanglement. For this, we consider two contributions to the characteristic timescale  $\tau_{\text{ent}} = 1/k_{\text{ent}}$  of entanglement: (i) the diffusive timescale  $\tau_{\rm diff}$  and (ii) the 'hooking' timescale  $\tau_{\rm hook}$ . The 'hooking' timescale is interpreted as the finite amount of time required for segments within the entanglement distance to become intertwined. In this study, we consider  $\tau_{\text{hook}}$  to be a constant model parameter that does not depend on the distance between the dangling end and the proposed entanglement section.

The diffusive timescale can be expressed using the Einstein relation, 40 wherein the characteristic timescale of diffusion  $\tau_{\text{diff}}(d)$ over a distance d may be approximated as  $\tau_{\text{diff}}(d) \approx d^2/D_{\text{chain}}$ 

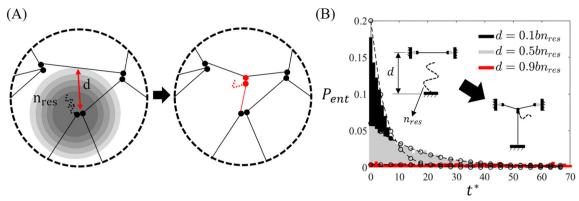


Fig. 5 (A) Schematic representing a section of a network where a dangling end with  $n_{\rm res}$  Kuhn segments is diffusing in space around it. The grey rings show the probability of finding the chain at each radius, and no dangling end subchain can diffuse to a distance larger than  $bn_{res}$ . (B) The probability distribution of entanglement creation  $P_{\text{ent}}$  is plotted over normalized time  $t^* = tkT/\zeta b^3$  for a dangling end with  $n_{\text{res}} = 100$  and a potential subchain at distance d. Dashed curves are the theoretical distribution given in eqn (16).

where  $D_{\text{chain}} = kT/\mu n_{\text{res}}$  is the diffusion coefficient for the dangling end subchain.1 Since dangling ends are tension-free, they most likely reside at their rest length  $r_0 = bn_{\rm res}^{0.6}$  and are unlikely to diverge from this length due to strong volumetric exclusion. We can, therefore, assume that dangling ends need to diffuse a distance of  $d-bn_{\rm res}^{0.6}$  to reach their target subchain. With this said, when  $d-bn_{\rm res}^{0.6}$  approaches the contour length of the polymer chain, its diffusion is greatly hindered by nonlinear entropic elasticity. We, therefore, normalize the diffusion time by the quantity  $(bn_{res} - d)^{-1}$ , making it impossible to diffuse over a total distance greater than its contour length. The timescale of diffusion can then be expressed as

$$\tau_{\rm dif}(n_{\rm res}, d) \approx \frac{\mu n_{\rm res}}{kT} (d - b n_{\rm res}^{0.6})^2 \cdot (b n_{\rm res} - d)^{-1}.$$
(14)

Finally, we may express the entanglement rate  $k_{\text{ent}}$  as a function of the distance d between the dangling end and the proposed entanglement junction and the number  $n_{res}$  of monomers in the dangling end to be

$$k_{\text{ent}}(n_{\text{res}}, d) = \frac{1}{\tau_{\text{dif}}(n_{\text{res}}, d) + \tau_{\text{book}}}$$
 (15)

To illustrate this stochastic event, let us consider the situation depicted in Fig. 5A, where a dangling end with  $n_{res} = 100$  Kuhn segments originates from a fixed location at a distance d from a potential target subchain. We then assess the model prediction regarding the time t for an entanglement event to take place between those subchains. Due to the stochasticity of this mechanism, the results are expressed as the probability density  $P_{\rm ent}$  of occurring at a specific time. The data shown in Fig. 5B is the result of 10<sup>4</sup> simulations used to record the time at which reentanglement happens. Results confirm that the probability  $P_{\text{ent}}$ follows a Poisson distribution consistent with eqn (13). To assess the dependency of this distribution with distance d, this exercise was repeated for three values of d. Results show, as expected, that smaller distances ( $d = 0.1bn_{res}$ ) are associated with shorter mean entanglement times while larger distances ( $d = 0.9bn_{res}$ ) increase this time until the entanglement event may even no longer take place. The resulting probability densities can be verified by the theoretical curve explaining the Poisson process, which is the exponential distribution expressed as

$$P_{\rm ent} = k_{\rm ent} e^{-k_{\rm ent}t}. (16)$$

By plotting the exponential distribution curves it can be seen that results from the stochastically implemented model, match well with the exponential distribution of each case of simulation.

## 3 Modeling polymer networks

In this section, the previously introduced physical laws are incorporated into a discrete meso-scale model. We consider finite two-dimensional periodic domains, wherein the motion of entanglement junctions is governed by eqn (6), and sliding dynamics are described by eqn (9). The network is generated using a random walk method to capture the stochastic behavior of polymer chain configurations, following the approach outlined by Doi. 40 Implementation details are provided, along with a simulation that visualizes the evolution of the network and the resulting mechanical response.

#### 3.1 Network generation

In this study, we focus on the generation of two-dimensional (2D) networks through a series of computational steps to achieve an equilibrium state. The process begins with the creation of an initial network using a discrete random walk method44 on an  $N_{\rm cell} \times N_{\rm cell}$  grid, where each cell has dimensions of  $l_{\rm cell} \times l_{\rm cell}$ . The total number of chains,  $N_{\text{chains}}$ , is defined by

$$N_{\text{chains}} = \frac{2(N_{\text{cell}} \times l_{\text{cell}})^2}{N_{\text{subchain}} + 1},$$
(17)

and each chain is represented by a random walk consisting of  $N_{\text{subchain}}$  steps, as illustrated in Fig. 6A. The random walk is initiated from a randomly selected cell, and subsequent steps are taken randomly to neighboring Moore cells<sup>45</sup> until the subchains for that chain are fully generated. During this process, the random walk is constrained such that it cannot intersect it's previous cell. This operation is repeated for all

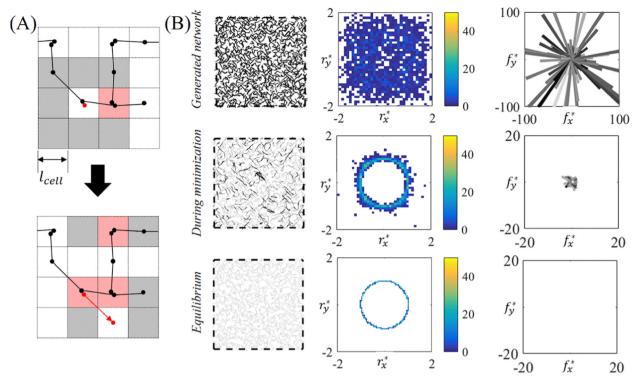


Fig. 6 (A) Random walk procedure for the red subchain where it has chosen a random start point as the initial entanglement. As it can be seen it takes a step to one of the Moore neighbor cells randomly and this continues for each chain until full walking of the network. A chain cannot walk to previous cell or the cells that are already occupied by two nodes. (B) Snapshots of generated networks immediately after generation and during equilibration, where color map shows the magnitude of tension in subchains. The generated network initially exhibits numerous black subchains, indicating regions of tension. Upon reaching equilibrium, these subchains transition to a light grey color, signifying their relaxation into a rest state. Also the radial force density plots and end-to-end vector distributions are shown for each stage. These plots can help to capture local stresses and strains in addition to the total virial stress.

chains, with the total number of chains (or chain density) determining the number of separate random walks generated on the grid. Following the initial network generation, entanglement junctions are identified at points where two chains intersect, involving exactly two nodes. To prevent overlapping entanglements, the random walk is restricted from selecting Moore neighbor cells that are already occupied by two nodes (i.e., where an entanglement is already present). For simplicity, this study focuses on mono-disperse networks, where all subchains have an equal number of Kuhn segments,  $N_{\text{Kuhn}}$ . After constructing the network, energy minimization is performed to bring the system to a global equilibrium state before conducting stress relaxation simulations.

### 3.2 Numerical scheme and energy minimization

To perform energy minimization during discrete time steps, both for the initial network equilibration and throughout the simulations, it is necessary to numerically integrate the displacement of nodes and the reptation of chains through each entanglement node pair. Defining equilibrium requires quantifying the stress at the network scale, which is determined using the virial formulation given by:<sup>46</sup>

$$\sigma_{ij} = \frac{1}{2V} \sum r_i \otimes t_j, \tag{18}$$

Where *V* is the volume of the domain, and the sum is taken over all the bonded interactions per node. Here, the inertial term of the virial stress is not considered since the overdamped assumption implies that the nodes' inertia is negligible. Now we can define the equilibrium as  $\sigma_{ij} < \chi_{TOL}$ , where  $\chi_{TOL}$  is a numerical tolerance. In this work, we use  $\chi_{\text{TOL}} = 1 \times 10^{-6} (kT/b^3)$ . Finally, to perform the energy minimization, we integrate the position of nodes (eqn (6)) and flow of Kuhn segments (eqn (9)) using the discrete forward Euler method whose details are found in Appendix B.

In Fig. 6B, we illustrate three snapshots of a network as generated, during minimization, and at equilibrium. The network includes  $N_{\text{chains}} = 800$  chains, each having  $N_{\text{subchain}} = 4$ internal subchains and two dangling ends. Regarding Kuhn segments, we have set  $N_{\text{Kuhn}}$  = 150 for internal subchains and  $N_{\text{Kuhn}}$  = 100 for dangling ends. The network is generated on a two-dimensional periodic square domain with length 800b with an area equal to the combined area of all Kuhn segments. In each snapshot, subchains under high tension are illustrated in black and they are shown thicker. To assess the topology of the network, we present two-dimensional histograms (Fig. 6B) of the normalized components of the end-to-end vector,  $r_{\rm v}^* =$  $r_x/b$  and  $r_y^* = r_y/b$ , at each phase. To capture the local stresses in an average manner, we have also plotted radial force density plots in which the normalized average force components,

Soft Matter

 $f_x^* = f_x b/kT$  and  $f_y^* = f_y b/kT$ , of the subchains oriented in each radial plane section is calculated and plotted. The gray-scale color map is based on the normalized population of each radial section (i.e., the number of subchains oriented in the range of the section divided by a maximum number of subchains between all planar sections). The progression of each of these quantities illustrates the path from a randomly generated initially out-of-equilibrium network to one that is in internal equilibrium. In the network snapshots, we see that chains have faded from black (high tension) to light grey (no tension), and the entanglement junctions have become more randomly distributed in space. From the histograms, we see that each endto-end vector has approached its resting length  $r_0 = bN_{\text{Kuhn}}^{0.6}$ and is uniformly distributed in all directions. Finally, we see that the forces vanish in the radial plots, indicating that all subchains are force-free. In subsequent network illustrations, we omit the scale bars and legends from the histogram and force density plots to prevent overcrowding. Note that, in all presented results, the scale bars are kept constant for comparison. We next present the basic mechanical response of an entangled network undergoing stress relaxation.

#### 3.3 Basic mechanical response during stress relaxation test

The discrete numerical schemes presented in the previous section were implemented as a custom 'fix' in the LAMMPS molecular dynamics codebase. The this section, we illustrate its basic modeling capabilities by considering a fully entangled network subject to stress relaxation conditions. The custom-developed numerical scheme is capable of modeling both three- and two-dimensional networks (Fig. 7). However, due to computational cost of three-dimensional simulations and because similar trends are effectively captured regardless of dimensionality, the remainder of this work exclusively focuses on two-dimensional networks. The two dimensional entangled network is generated with  $N_{\rm chains} = 800$  where each chain consists of  $N_{\rm subchain} = 4$  subchains (divided by 5 entanglements) and each subchain has  $N_{\rm Kuhn} = 150$  Kuhn segments. The network is generated on a periodic square domain with initial

length of 800b. The coefficient for medium viscosity is set equal to  $\mu = 10^{-2} \zeta b$ , and it must be noted that medium viscosity here is chosen so that characteristic timescale of viscous motion of entanglements is much smaller than simulation timestep. The discrete timestep is set equal to  $\Delta t = 10^{-6} (\zeta b^3 / kT)$ . After equilibrating the network, we stretch the domain uni-axially with non-dimensional strain rate value of  $\Theta = 1$  up to twice its initial length  $(\varepsilon_{11} = (L_{\Omega} - L_{\Omega_0})/L_{\Omega_0} = 1)$  in an isochoric manner (Fig. 8). In the second phase, a relaxation regime ensues, during which stretch is held constant until a new equilibrium state is achieved. In Fig. 8A, we plot the normalized tensile stress  $\sigma_{11}^* =$  $\sigma b^3/kT$  versus normalized time  $t^* = tkT/\zeta b^3$  during the experiment. Five representative moments during the simulation are chosen (labeled 1-5) as indicated, and snapshots of the network configuration at these times are illustrated in Fig. 8B. Histograms of the end-to-end vectors and force density plots, as defined in Fig. 6, are plotted at these times in Fig. 8C. During loading, we see an initial rise in stress as chains begin storing elastic energy in response to the deformation. The plateau just before point (2) indicates that a significant number of disentanglements occur as the reserve of many dangling ends is depleted. As indicated in the histograms and force distribution plots, we observe a high degree of alignment of chains with the loading direction, as would be expected in a flexible polymer network.

During the relaxation phase, two mechanisms work together to dissipate energy: (i) the reptation of segments from the dangling ends into the elastic subchains and (ii) disentanglement events. In the first process, segments flowing out of the dangling ends and into the elastic subchains leads to a larger contour length of the elastic subchains, which, in turn, leads to a softer response. Thus, the reptation of segments releases elastic energy by effectively softening the entropic springs of chains that are in tension. In contrast, disentanglement events completely dissipate all elastic energy that was stored in chains connected to the disentangled node. The insets of Fig. 8B highlight a disentanglement event occurring between time 2 and time 3. As each node in our network represents an entanglement junction, the network eventually releases all

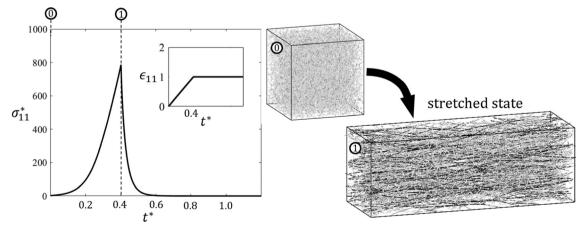


Fig. 7 Stress relaxation test is performed on a three dimensional network. The greyscale color map of the chains is representative of tension in each chain where white chains are tension free and black ones are mostly tensioned.

stored elastic energy as  $t^* \to \infty$  as indicated by the vanishing stress and chain tension. In a network with covalent crosslinks, some long-term elasticity would be maintained, as explored in the next section. Interestingly, we observe in panel 4 that the final resting configuration of the network is anisotropic, as indicated by the histogram. While this may reflect the alignment of polymer chains during the deformation, we acknowledge that the periodic  $e_1$  dimension has increased during the deformation with respect to the periodic  $e_2$  dimension, which could induce sampling bias in our calculation. Nonetheless, we do observe the existence of aligned 'pockets' even in the long-term equilibrium state. The observed anisotropy in the final equilibrium state, and the inability to capture chains retracting to their initial configuration, arises from the inclusion of volume exclusion effects of Kuhn segments within the chain energy expression (eqn (3)). This approach is not the most accurate representation of volumetric forces, as such forces are inherently many-body interactions. Specifically, volumetric interactions occur between all Kuhn segments across all subchains, rather than being limited to a single subchain. Consequently, the chains relax to a non-zero end-to-end distance determined by the number of Kuhn segments in each chain. While it is theoretically possible to introduce thermal fluctuations into the simulations, doing so would not resolve the anisotropy in the final configuration. This limitation stems from the combination of a volumetric force, which inherently acts isotropically in all directions, with a chain force modeled as a one-dimensional interaction. To overcome this limitation, we are actively developing a multi-body potential framework that can more accurately capture volumetric interactions. This approach would enable interactions between Kuhn segments to be modeled in a more realistic manner, leading to chain retraction and a uniform final configuration.

### 4 Results

With the foundational framework now implemented, we can investigate the influence of network architectural parameters on the macroscopic mechanical response and network reorganization. As described in Section 3.1, the number of subchains per chain, N<sub>subchain</sub>, serves as an input parameter for the network generator, effectively representing chain length. Furthermore, we examine entangled networks in which a fraction of the entanglements,  $p_{\text{covalent}}$ , are covalently locked. The proportion of covalent cross-links ranges from  $p_{\text{covalent}}$  = 0%, representing a fully entangled network, to  $p_{\text{covalent}} = 100\%$ , which corresponds to a fully cross-linked network. This framework allows us to study the effects of chain length and covalent cross-linking on macroscopic stress, local strains, and forces by conducting stress relaxation tests across various networks, systematically varying each parameter.

#### 4.1 Network re-organization and stress relaxation

As observed in Fig. 8C, the length and orientation distributions of subchains change throughout the stress relaxation test, as

demonstrated by the histograms of end-to-end vectors. During deformation, subchains aligned approximately in the direction of the applied strain experience the greatest elongation. Force density plots indicate that these subchains bear the majority of the load, while subchains oriented perpendicularly to the deformation carry minimal force. However, during the relaxation phase, the stretched subchains pull additional Kuhn segments from less stretched neighboring subchains, eventually relaxing to a new equilibrium state. This behavior is confirmed by the force density plots, where all energy is dissipated (force is fully relaxed), leaving no subchains under tension. The reorganization observed during relaxation is primarily driven by reptation, disentanglements, and re-entanglements. Reptation continues until tension is eliminated in all subchains, allowing fully entangled networks to redistribute stress and dissipate the stored elastic energy. In the following, we first examine the effect of strain rate, demonstrating that entangled networks can exhibit a range of stress responses, from elastic solid-like behavior to viscous fluid-like behavior, depending on the rate of deformation. Subsequently, we will investigate the influence of the two architectural parameters introduced earlier on the network's mechanical response.

**4.1.1** Effect of strain rate. As shown in Fig. 9, three stress relaxation simulations were conducted at different strain rates:  $\Theta$  = 1.00,  $\Theta$  = 0.25, and  $\Theta$  = 0.1 on the same fully entangled network discussed in Section 3.3. In each simulation, the network domain is deformed up to twice its initial length  $(\varepsilon_{11} = 1)$  under isochoric conditions. The normalized uni-axial component of the resulting virial stress,  $\sigma_{11}^* = \sigma_{11}b^3/kT$ , is plotted against normalized time,  $t^* = tkT/\zeta b^3$ , for each simulation (Fig. 9A). The results reveal that the stress response is highly dependent on the applied strain rate. When deformation is applied relatively quickly (black curve), the network exhibits behavior resembling that of an elastic solid. As the strain rate decreases (gray curve), the network's stress response becomes more characteristic of a polymer melt. The observed rate dependency arises from the time-dependent nature of reptation, which operates on a specific timescale  $\tau = \zeta b^3/kT$  determined by the friction coefficient. When the network chains are stretched slowly relative to this timescale, reptation has sufficient time to dissipate the stored elastic energy concurrently with deformation, resulting in a lower stress. Conversely, when the network is deformed rapidly, reptation cannot keep pace with the deformation, leading to higher stress at the end of the deformation phase. To analyze network reorganization, local strains and forces were examined through end-to-end vector histograms and force density plots at the end of the deformation phase for each simulation. Our results indicate that, under fast deformation, slightly larger local strains are imposed on subchains, particularly those oriented in the direction of deformation. As the strain rate decreases, the magnitude of local strains slightly diminishes, but the distortion of the sub-chain distribution intensifies. Additionally, force density plots reveal that subchains oriented in the direction of stretch are primarily responsible for carrying the load in all experiments, although the intensity of the imposed forces is significantly lower when the strain rate is reduced. We have additionally plotted the

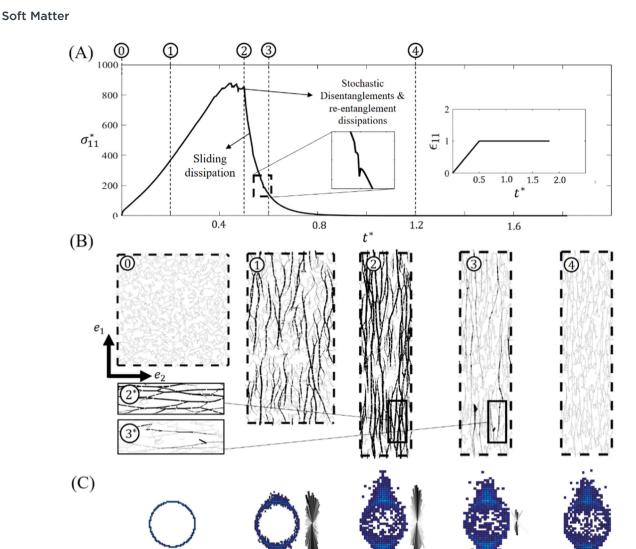


Fig. 8 (A) Normalized uni-axial component of stress  $\sigma_{11}^* = \sigma_{11} b^3/kT$  is plotted versus normalized time  $t^* = tkT/\zeta b^3$  for the stress relaxation test performed on a network of fully entangled chains. (B) Network snapshots at specified time frames are shown. The sub-figures are comparing the topology of a local section after a few disentanglements and re-entanglements occurred. (C) The end-to-end vector histograms and force density plots are plotted at the same time frames to capture local forces and stretches applied to subchains. As it can be seen in force density plots all the chains have relaxed completely by time frame (4).

relaxation section of the stress response for each simulation on a logarithmic scale (Fig. 9B). Similar relaxation behaviors have previously been observed in molecular dynamics simulations, as reported by O'Connor et al.48 This qualitative agreement suggests that our network model may serve as a valuable tool for bridging molecular dynamics with continuum-scale modeling in future studies.

4.1.2 Effect of chain length. To investigate the effect of chain length, networks with varying numbers of subchains (per chain) were generated and subjected to identical stress relaxation tests. The domain size and network parameters were kept consistent with those used in previous simulations (Section 3.3). To maintain constant chain concentration, as per eqn (17), networks with longer chains contained fewer total chains compared to those with shorter chains. Fig. 10A illustrates

the deformation of networks with different chain lengths  $(N_{\text{subchain}} = 4, N_{\text{subchain}} = 8, N_{\text{subchain}} = 16, \text{ and } N_{\text{subchain}} = 32)$ up to twice their initial length under a true strain rate of  $\dot{\varepsilon}_{11}$  = 1. The normalized tensile stress,  $\sigma_{11}^* = \sigma_{11}b^3/kT$ , is plotted against normalized time,  $t^* = tkT/\zeta b^3$ , during the stress relaxation tests. The model predicts that networks with longer chains exhibit higher stress at the end of the deformation phase and longer relaxation timescales. In the subplots of Fig. 10A, the relaxation timescale of the network,  $\tau_{relax}$ , is normalized  $(\tau_{\rm relax}^* = \tau_{\rm relax}(kT/\zeta b^3))$  and plotted versus  $N_{\rm chain}$  to demonstrate that an increased chain length inherently extends the relaxation timescale of the network. These relaxation timescales were estimated by fitting exponential decay functions to the stress *versus* time data during the relaxation phase. This increase in relaxation time can be attributed to the fact that

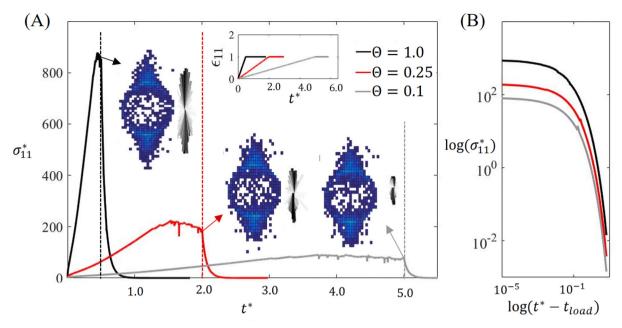


Fig. 9 (A) Normalized uni-axial stress  $\sigma_{11}^*$  is plotted versus normalized time  $t^*$  for the stress relaxation tests with three different strain rates of  $\dot{\epsilon}_{11} = 1.00$ ,  $\dot{\epsilon}_{11}=0.25$  and  $\dot{\epsilon}_{11}=0.1$ . End-to-end vector histograms and force density plots are shown at the end of deformation phase for each simulation. (B) The relaxation section of normalized uni-axial stress is plotted versus normalized time in logarithmic scale.

relaxation of stressed subchains primarily occurs through reptation of Kuhn segments from less stressed neighboring subchains or stress-free dangling ends. For a chain with a larger number of subchains, Kuhn segments must traverse a longer distance to relieve stress in the middle subchains. Conversely, for shorter chains, Kuhn segments travel shorter distances. This mechanism also explains the higher stress observed at the end of the deformation phase in networks with longer chains, as the lower relaxation rate allows these networks to store more elastic energy during deformation. It must be noted that the similar dependency of relaxation timescale on the number of subchains per chain was previously captured by Masubuchi et al.29 A power-law fit of the relaxation timescale versus the number of subchains plot yields the relation  $\tau_{\rm relax} \propto N_{\rm subchain}^{1.67}$ , indicating that the relaxation timescale scales non-linearly with the number of subchains per chain. We note that the observed power law relation differs from that predicted by reptation theory, which suggests  $\tau_{\rm relax} \propto N_{\rm subchain}^3$ . However, the relaxation time dependence on the number of subchains is modified by two mechanisms: tube length fluctuations and constraint release (disentanglements), both of which serve to reduce the relaxation time. Given that our model incorporates both the spatial fluctuations of dangling ends and the effects of disentanglements, it is expected to observe a smaller power law dependence on  $N_{\text{subchain}}$ .

Additionally, end-to-end vector histograms and force density plots were analyzed at three different time points (labeled 0-2) to capture network distortion. Fig. 10B shows that histograms for networks with longer chains are both more stretched and distorted, indicating greater local strains on the subchains. Force density plots confirm this observation, revealing that networks with longer chains experience larger forces and

stretch compared to those with shorter chains, since reptation takes longer to relieve stress in these networks.

4.1.3 Effect of cross-link ratio. We previously introduced the concept of mixed networks, in which a fraction of entanglements are covalently locked, thereby preventing chain reptation through these junctions. To examine the impact of such covalent cross-links on macroscopic mechanical response, we generated five networks with varying covalent cross-link ratios:  $p_{\text{covalent}} = 0\%$ ,  $p_{\text{covalent}} = 40\%$ ,  $p_{\text{covalent}} = 60\%$ ,  $p_{\text{covalent}} =$ 80%, and  $p_{\text{covalent}}$  = 100%. We note that cross-links are introduced in the network after the initial energy minimization. This ensures that the generated network can reach a homogeneous mono-disperse distribution. The networks under investigation consist of  $N_{\text{chain}}$  = 800 chains, each composed of  $N_{\text{subchain}}$  = 4 subchains, with each subchain containing  $N_{\text{Kuhn}} = 150 \text{ Kuhn}$ segments. These networks are generated on a square domain with an initial length of 800b. The medium viscosity coefficient is set to  $\mu = 10^{-2} \zeta b$ , and the discrete time step is  $\Delta t =$  $10^{-6}(\zeta b^3/kT)$ . Following initial equilibration, the networks are deformed isochorically with a strain rate of  $\dot{\varepsilon}_{11}$  = 1 up to twice their initial length  $(\varepsilon_{11} = 1)$  and subsequently held at the deformed state. Analysis of the stress relaxation curves presented in Fig. 11A reveals that the introduction of covalent cross-links into the entangled networks significantly alters their viscoelastic behavior. Initially, it is observed, in normalized stress  $\sigma_{11}^*$  versus normalized time  $t^*$  plots, that networks with a higher ratio of covalent cross-links exhibit greater stress at the end of the deformation phase (see Fig. 11A). Furthermore, the inclusion of these cross-links prolongs the relaxation timescale. When the covalent cross-link ratio exceeds a critical threshold of  $p_{\rm covalent} \approx 41\%$ , the network is unable to fully relax the applied stress. This indicates a transition from a viscoelastic

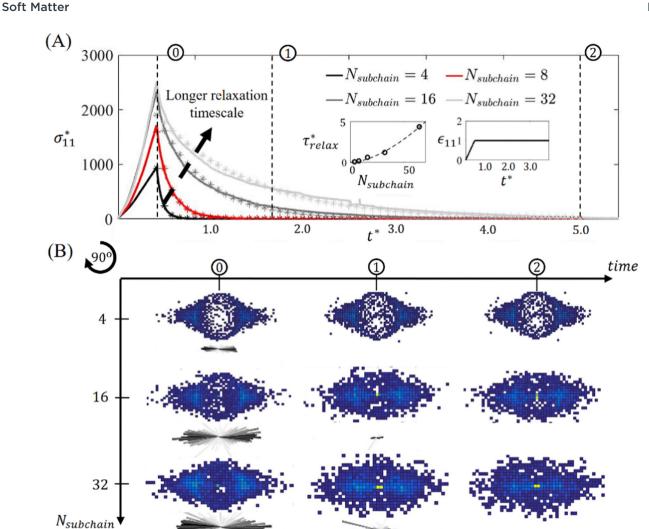


Fig. 10 (A) Normalized uni-axial component of stress  $\sigma_{11}^*$  is plotted against normalized time  $t^*$  for a stress relaxation test on four networks each with different chain sizes. One subplots shows the uni-axial strain  $\varepsilon_{11}$  versus normalized time  $t^*$  which is identical for all four simulation. Also one other subplot is showing the relaxation timescale  $au^*_{\text{relax}}$  versus number of subchains per chain  $N_{\text{subchain}}$ . (B) Force density plots and end-to-end vector histograms are plotted at three different time frames of simulation for different chain lengths of  $N_{\text{subchain}} = 4$ ,  $N_{\text{subchain}} = 16$  and  $N_{\text{subchain}} = 32$ .

fluid-like response to a viscoelastic solid-like behavior. The underlying reason for this transition is that covalent crosslinks act as barriers to the reptation mechanism. When a sufficient number of cross-links are present, they can obstruct the reptation pathways for some chains, thereby impeding their ability to relax stress (see Fig. 11A). Consequently, deformation applied to the network may result in some chains retaining residual stress even after the system reaches equilibrium.

End-to-end vector histograms and force density plots (Fig. 11B) were generated for each network at the end of the deformation phase and after reaching equilibrium to illustrate the impact of covalent cross-links on local strains and forces. The data show that the introduction of cross-links leads to slightly higher localized strains on subchains. Force density plots confirm that, beyond a certain ratio of covalent cross-links, the network fails to relax all subchains, with some remaining stretched even after equilibrium is achieved. Notably, end-to-end vector histograms indicate that adding covalent cross-links results in less distortion of the network distribution. This observation may be attributed to the absence of reptation, disentanglements, and re-entanglements in a fully cross-linked network, which significantly affects the dispersity of subchain lengths and the network's topological organization.

To elucidate the impact of covalent cross-links on stress relaxation, we present the normalized relaxed stress,  $\sigma_{11}^{\infty}/\sigma_{11}^{\text{max}}$ , where  $\sigma_{11}^{\infty}$  represents the stress after sufficient time has passed for network to equilibrate and  $\sigma_{11}^{\text{max}}$  is the maximum attained stress (Fig. 12). This normalized stress is plotted as a function of the covalent cross-link fraction,  $p_{\text{covalent}}$ , with each data point corresponding to a separate stress relaxation test. Additionally, snapshots of equilibrated networks at the end of the stress relaxation tests are provided at four times labeled 1 to 4. In these snapshots, stress-free subchains are depicted as thin grey lines, while highly tensioned subchains are represented by thick black lines.

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(A) **(** 4000  $p_{covalent} = 0\%$  $-p_{covalent} = 40\%$ 3000  $p_{covalent} = 60\%$  $\sigma_{11}^*_{2000}$ 2.0  $p_{covalent} = 80\%$  $p_{covalent} = 100\%$ 1000 0.5 1.0 3.5 3.0 ť, (B) 80% 100% 40% 60%  $p_{covalent}$ 

Fig. 11 (A) Normalized uni-axial component of stress  $\sigma_{11}^*$  is plotted as a function of time  $t^*$  during stress relaxation tests on five networks with different covalent cross-link ratios. (B) End-to-end vector histograms and force density plots are shown for each experiment at the end of deformation phase and after reaching equilibrium.

The results demonstrate that at low or zero covalent crosslink fractions, the network relaxes all the applied stress, resulting in stress-free subchains at the end of the stress relaxation test, as shown in subplot 1 of Fig. 12. However, beyond a critical cross-link density  $p_{\text{covalent}} \approx 41\%$ , the network's ability to fully relax the stress is hindered, with some subchains remaining in tension at the end of the test (subplot 2, Fig. 12). This occurs because the covalent cross-links restrict the reptation pathways for these subchains. As the covalent cross-link fraction increases more, the network retains a larger portion of the imposed stress. At  $p_{\text{covalent}}$  = 100%, the network conserves all the imposed stress, as evidenced by the presence of numerous highly stretched subchains in subplot 4 of Fig. 12.

# 5 Concluding remarks

In conclusion, we introduced a discrete network model designed to capture the time-dependent mechanical response of entangled

polymer networks and its relationship with the underlying local physics, including chain stretch, reptation, entanglements, and disentanglement. This approach is driven by the need to understand how the architecture of polymer networks and their dynamic changes during deformation - such as topological shifts and chain rupture - affect the complex mechanical behavior observed in experiments. Our network model aims to improve the current understanding while maintaining a relatively simplified form leading to lower computational cost compared to traditional molecular dynamics simulations. We have demonstrated the utility of this model through a series of elementary examples and extended its application to investigate the response of networks containing a mixture of covalent bonds and entanglements, which are representative of many synthetic polymers.

In summary, we have reproduced a similar stress relaxation trend as previously reported by Masubuchi et al. 25,49 Additionally, we demonstrated that the relaxation timescale of the network exhibits a power-law dependency on the number of

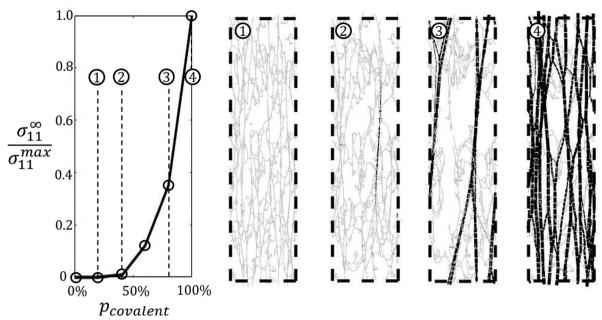


Fig. 12 Normalized stress  $\sigma_{11}^{\alpha}/\sigma_{11}^{\text{max}}$  is plotted against covalent cross-link ratio  $\rho_{\text{covalent}}$ . Also network snapshots are provided at four different covalent ratios  $p_{\text{covalent}} = 20\%$ ,  $p_{\text{covalent}} = 41\%$ ,  $p_{\text{covalent}} = 80\%$  and  $p_{\text{covalent}} = 100\%$  after the network is equilibrated in deformed form.

subchains per chain (i.e., chain length), characterized as  $au_{
m relax} \propto N_{
m subchain}^{1.67}$ . This dependency was also observed in the work of Masubuchi,29 where the molecular mass of the chains—effectively their length—was varied and longer relaxation times were observed for networks with longer chains. As discussed in Section 4.1.2, the divergence of this power law from that predicted by reptation theory<sup>4</sup> arises due to the latter's exclusion of tube length fluctuations and constraint release mechanisms, both of which reduce the relaxation time.

Furthermore, we conducted stress relaxation experiments using the model on mixed networks comprising both entangled junctions and covalently cross-linked junctions. These experiments revealed that the incorporation of cross-linking points significantly influences the viscoelastic properties of entangled networks. Specifically, beyond a critical proportion of covalently cross-linked junctions (41%), the network's mechanical response transitions from that of a viscoelastic fluid—capable of dissipating all imposed energy through stretching-to that of a viscoelastic solid, which can only dissipate a part of the imposed energy. The mechanics and failure mechanisms of such networks have been extensively studied in prior experimental<sup>6</sup> and theoretical investigations.<sup>50</sup>

While our discrete network model provides a powerful framework for understanding the time-dependent mechanical response of entangled polymer networks, there are several limitations that highlight areas for future improvement. First, the model currently assumes a Gaussian response for the polymer chains, which is a reasonable approximation for small deformations but becomes less accurate as the deformation increases, especially near fracture. For large deformations, more realistic models, such as the Langevin chain model, should be considered. The Langevin model accounts for the finite extensibility of polymer chains, providing a more accurate description of the material's behavior under extreme conditions. Second, the current implementation of chain sliding at entanglement points does not account for the force dependence of the friction law.6 Introducing a force-dependent friction law in future versions of the model would allow for a more accurate capture of the nonlinearity observed in polymer rheology.<sup>51</sup> This enhancement would better represent how the resistance to chain motion varies with the applied force, leading to a more realistic description of the material's mechanical response.

It is important to note that this model is also capable of studying the viscoplastic behavior of entangled polymer networks. Viscoplasticity, which describes the time-dependent irreversible deformation of materials under applied stress, is a key characteristic of entangled networks. 52 By capturing the complex interplay between molecular chains, entanglements, and external forces, this model provides valuable insights into how these networks respond under prolonged loading conditions, making it a versatile tool for investigating both elastic and plastic deformation behaviors.

Looking ahead, integrating our network approach with molecular dynamics simulations has the potential to enhance the model's realism. By performing molecular dynamics simulations on small domains, we can extract key physical parameters, such as chain friction and initial network topology, which can then be fed into the network model. This hybrid approach will allow us to model larger domains (up to several microns) while maintaining computational efficiency. Ultimately, this may enable a deeper understanding of how network design influences complex phenomena such as fracture, cavitation, and nonlinear rheology in a wide variety of polymers, including pressure-sensitive adhesives.

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## Data availability

The data and code supporting the findings of this study on "Nonaffine Motion and Network Reorganization in Entangled Polymer Networks" are not publicly available due to confidentiality agreements with 3M, the funding organization for this research. Access to the data and code is restricted as they contain proprietary information.

### Conflicts of interest

There are no conflicts to declare.

# **Appendices**

#### Appendix A: proof of critical stretch equation for disentanglement

As it can be seen in (Fig. 4A), the subchain initially at equilibrium with  $n_0$  Kuhn segments is stretched by factor  $\lambda$ . It is shown that initial subchain at equilibrium has length of  $r_0$  =  $bn_0^{0.6}$  and after the deformation it will have new length of  $\lambda r_0$ . Due to tension difference Kuhn segments will flow from dangling end to stretched subchain until new equilibrium point. We can calculate that a subchain with length  $\lambda r_0$  requires  $(\lambda r_0/b)^{5/3}$  or  $n_0\lambda^{5/3}$  Kuhn segments to be at relaxed state. The disentanglement always happens if the difference between required number of Kuhn segments and initial one is greater than number Kuhn segments in the dangling end  $n_{res}$ :

$$n_0 \lambda^{5/3} - n_0 > n_{\rm res} \tag{19}$$

Based on this, the critical stretch above which disentanglement always happens for the system shown in (Fig. 4A) can be calculated as:

$$\lambda_{\text{crit}} = \left(\frac{n_{\text{res}}}{n_0} + 1\right)^{0.6}.\tag{20}$$

#### Appendix B: forward Euler integration scheme

By minimizing free energy and using a Langevin equation, we found the equation of motion for each node (eqn (6)). We can numerically solve this ordinary differential equation for each node by writing it in discrete forward Euler form as

$$\mathbf{x}_i(t+\Delta t) = \mathbf{x}_i(t) + \frac{\left(\mathbf{t}_i + \mathbf{t}_{i-1} + \mathbf{t}_j + \mathbf{t}_{j-1}\right)}{\mu} \Delta t.$$
 (21)

The other side of energy minimization is related to reptation, where we integrate the flow of Kuhn segments through each node by discretizing (eqn (9)) as

$$n_i(t + \Delta t) = n_i(t) + \left(\frac{\Pi_i - \Pi_{i-1}}{\zeta}\right) \Delta t.$$
 (22)

Using the equations above, nodal positions and monomer flows are numerically integrated after each discrete timestep  $\Delta t$ .

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