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Nanorod Diffusion in Polymer Nanocomposites by Molecular Dynamics Simulations

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8 Supporting Information

ABSTRACT: Nanorod diffusion and polymer dynamics in nano-9 composites were investigated by means of molecular dynamics simulations. 10 We show that thin nanorods (spherocylinders) can diffuse much faster 11 than that predicted by a Stokes-Einstein continuum model, similar to 12 experiments, in the dilute nanorod regime. In entangled polymer matrices, 13 nanorod diffusion reaches a plateau region. Increase of the nanorod 14 diameter or aspect ratio (AR) slows its diffusion. The nanorod diffusion 15 regime, at long time scales, displays a non-Gaussian behavior as is depicted 16 by the several Gaussian peaks present in the self-part of the van Hove 17 18 function. We also show that the unentangled polymer dynamics decreases

in the nanocomposite due to the nanorod's interfacial area.

I. INTRODUCTION

20 The dispersion of spherical nanoparticles or anisotropic 21 nanorods (NRs) into a dense polymer matrix can enhance 22 the mechanical,^{1,2} electrical, optical,³ and plasmonic⁴ proper-23 ties of the materials. There are different diffusion regimes of 24 the nanoparticles into a polymer matrix which can be 25 distinguished by calculating the mean-square displacement ₂₆ (MSD) of the nanoparticles as a function of time.⁵ On very 27 short time scales, there is a ballistic motion of the nanoparticles 28 where MSD ~ $t^{2.6}$ Beyond that regime, there is subdiffusion ²⁹ motion of the nanoparticles where MSD ~ $t^{0.5}$, while at longer 30 times the nanoparticles follow a Fickian diffusive motion where 31 MSD ~ t^1 . The theory of Stokes–Einstein predicts the 32 Brownian diffusive motion of (nano)particles⁷ in a viscous 33 medium (either polymer matrix or solvent). In the case of NRs 34 in a medium, the Stokes–Einstein equation can be modified⁸ 35 to predict their Brownian diffusive motion in a dilute nanorod 36 regime. Such a continuum model predicts a decrease of the $_{37}$ nanorod diffusion with molecular weight of the matrix (M). $_{38}$ However, if the nanorod's diameter D is smaller than the tube 39 diameter of the polymer matrix, $d_{\rm T}$, diffusion does not follow 40 the Stokes-Einstein modified formula according to experi-41 ments.^{9,10} This is also the case for spherical nanoparticles into 42 a polymer matrix.¹¹⁻²² In particular, by use of Rutherford 43 backscattering spectrometry, the diffusion of titanium dioxide 44 (TiO₂) nanorods (of length L = 43 nm, diameter D = 5 nm, 45 and aspect ratio AR \approx 9) was measured in a polystyrene matrix 46 (the molecular weights (M) of the matrix range from 9 to 2000 47 kDa, $D/d_{\rm T} = 0.51 - 0.575$).¹⁰ In the entangled polymer matrix,



the diffusion coefficients (*D*) of TiO₂ nanorods¹⁰ decreases as ⁴⁸ $M^{-1.4}$, whereas the Stokes–Einstein continuum model (CM) ⁴⁹ predicts a M^{-3} dependence due to the molecular weight ⁵⁰ dependence of matrix viscosity. Thus, TiO₂ nanorod diffusion ⁵¹ in PS melts is faster than that predicted by the Stokes–Einstein ⁵² continuum model. In contrast, the theory of de Gennes and ⁵³ Wyart^{23,24} predicted that nanorod's motion does not depend ⁵⁴ on polymer molecular weight. ⁵⁵

In a recent study, the mobility of gold nanorods within 56 entangled wormlike micelle solution²⁵ was investigated by X- 57 ray photon correlation (XPCS) spectroscopy. It was found that 58 on short time scales, which cannot be captured by XPCS 59 measurements, the nanorod motion is restricted to a 60 localization length, which is controlled by the elasticity of 61 the entangled micelles following the Stokes-Einstein relation 62 when the nanorod length is larger than the entanglement mesh. 63 On long time scales the nanorods diffuse with a diffusivity that 64 exceeds the Stokes-Einstein prediction following a "hopping" 65 nanoparticle mechanism similar to the one observed in 66 entangled polymer solutions.^{5,26–29} In addition, the transla- 67 tional and the rotational dynamics of a single thin gold 68 nanorod in solution have been studied recently by experi- 69 ments³⁰ and by coarse-grained simulations.^{31,32} These two 70 types of dynamics are decoupled in unentangled polymer 71 matrices.³¹ In another experimental study, multiple nanorods 72

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73 of certain diameter and concentration have been studied in 74 solutions.³³ By use of birefringence,³⁴ it was shown that the 75 orientational nanocelluloses dynamics depends on the 76 polydispersity of the nanorods. A non-Gaussian dynamics 77 (hopping) has also been observed in experimental systems of 78 polystyrene (PS) NPs in poly(ethylene oxide) (PEO) 79 solutions,³⁵ gold NPS in entangled poly(vinyl alcohol) 80 solutions,²⁹ and quantum dot NPs in polyacrylamide gels³⁶ 81 in coarse-grained models of polymer melt with spherical 82 nanoparticles^{18,37–39} and hard sphere fluid.⁴⁰

To the best of our knowledge there is not any simulation 83 84 work that mimics a nanocomposite⁴¹ (or suspension) 85 containing nanorods at a finite nanorod loading and 86 investigates the nanorod diffusion in a polymer matrix in 87 comparison to theory and experiments. In this article we 88 explore how thin nanorods (the nanorod diameter, D, is so smaller the polymer radius of gyration, R_g^{42-44}) diffuse in 90 dense polymer melts in comparison to experiments.¹⁰ The rest 91 of this paper is organized as follows. In section II the 92 simulation methodology and details are described. In section A 93 the structure of the nanorods inside unentangled and 94 entangled polymer matrices is investigated. In section B, 95 nanorod diffusion (and its mechanism) in both unentangled 96 and entangled polymer matrices is calculated, at dilute nanorod 97 loading, and compared to the Stokes-Einstein continuum 98 model and experiments. Subsequently, in section C the 99 unentangled polymer dynamics is investigated. Finally, in 100 section IV conclusions are presented.

II. SIMULATION METHODOLOGY

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101 Stochastic molecular dynamics simulations were implemented
 102 by using the GROMACS 4.5.3 package.^{19,45-48} In particular,
 103 the Newton–Langevin equations were solved:^{45,49}

$$m_i \frac{\mathrm{d}\mathbf{v}_i}{\mathrm{d}t} = -\nabla V_i - \Gamma \frac{\mathrm{d}\mathbf{r}_i}{\mathrm{d}t} + \mathbf{W}_i(t) \tag{1}$$

105 where V_i is the total potential experienced by particle *i* which is 106 a sum of three terms:

$$V_{i} = \sum_{j \neq i} \left(V_{ij}^{\text{LJ}} + V_{ij}^{\text{S}} + V_{ijk}^{\text{B}} \right)$$
(2)

¹⁰⁸ A particle *i* has mass m_i ; Γ is the friction coefficient, and \mathbf{W}_i is a ¹⁰⁹ random force. The total force \mathbf{f}_i on particle *i* is the gradient of ¹¹⁰ the V_i . The monomers of the polymer chain were connected ¹¹¹ using the FENE potential:⁴⁹

$$V_{ij}^{S} = -\frac{1}{2}kR_{0}^{2}\ln\left(1 - \frac{r^{2}}{R_{0}^{2}}\right)$$
(3)

¹¹³ The equilibrium bond length was set to $R_0 = 1.5$ and $k = 30.^{49}$ ¹¹⁴ We incorporated an intrinsic stiffness into the Kremer–Grest ¹¹⁵ model⁴⁹ through a harmonic potential⁵⁰ of the following form:

$$V_{ijk}^{\rm B} = \frac{1}{2} k_{\theta} (\cos \theta_{ijk} - \cos \theta_0)^2 \tag{4}$$

117 An equilibrium bending angle between three consecutive 118 monomers, $\theta_0 = 109.5^\circ$, with a bending force constant $k_{\theta} =$ 119 25^{50} was used. This polymer model results in an entanglement 120 length $N_e \approx 48$ (from the S-coil estimator^{39,51}) and polymer 121 tube diameter $d_T \approx 9.7\sigma_m$ using the geometrical analysis 122 method (Z1 code).⁵² The nanocomposite systems contain 123 nanorods (spherocylinders as depicted in Figure 1) which are 124 dispersed in a dense polymer matrix. For the nanorod



Figure 1. Picture of a spherocylinder nanorod with aspect ratio AR = 8 that is used in our study.

(spherocylinder), the relation $V_{ijk}^{\rm B} = \frac{1}{2}k_{\theta}(\theta_{ijk} - \theta_0)^2$ is used ¹²⁵ along three spheres of the nanorod where $\theta_0 = 180^\circ$ and $k_{\theta} = 126$ 50. The spheres of the nanorod are connected by the potential ¹²⁷ of the form $V_{ij}^{\rm S} = \frac{1}{2}k_0(r_{ij} - D)^2$, where $k_0 = 1111.2$.

The Lennard-Jones (LJ) potential V_{ij}^{LJ} which acts between 129 the centers of mass of two particles⁵³ is 130

$$V_{ij}^{\rm LJ} = 4\epsilon_{ij} \left(\frac{\sigma^{12}}{r_{ij}^{12}} - \frac{\sigma^6}{r_{ij}^6} \right)$$
(5) 131

where r_{ij} is the distance between particles *i* and *j*, ϵ_{ij} is the 132 interaction between particles *i* and *j* (specifically, for 133 monomers: $\epsilon_m = \sigma_m = m_m = 1$; for nanorods: $\epsilon_p = 1$, D = 1342R, $2R/\sigma_m = 1-4$, $m_p = 0.85\frac{4}{3}\pi R^3$). For monomer (m)– 135 nanorod (p) interactions the combination rules $\epsilon_{mp} = (\epsilon_m \epsilon_p)^{1/2}$ 136 and $\sigma_{mp} = (\sigma_m + D)/2^{53}$ were used. The monomers (or 137 nanorods) are modeled with the repulsive-only part of eq 5, 138 shifted, and truncated at cutoff radius at $r_c = 2^{1/6}\sigma_m$ ($r_c = 2^{1/6}\sigma_p$ 139 for nanorods). However, for the monomer–nanorod inter- 140 action, the cutoff radius of the LJ potential (eq 5) is $r_c = 141$ $2.4\sigma_{mp}$. The nonbonded intramolecular interaction between 142 the spheres of the nanorods is excluded. The total number of 143 monomers in the cubic simulation cell was either $N_t = 23600$ 144 or 47200 containing nanorods of diameter D = 1, 2, 3, or 4. 145 The simulated nanorod volume fraction ϕ is defined as 146

$$\phi = \frac{\pi D^2 L N_n}{6(V)} \approx 5\%$$
 (dilute nanorod loading that jamming does

not occur¹⁰), where $\langle V \rangle$ is the average volume of the 147 nanocomposite simulation box in the NPT ensemble. In 148 nanocomposites, the starting structures were created by an 149 ensemble of polymers with N = 200 (or N = 400) and 150 nanorods inserted at random positions within a large 151 simulation box. For equilibration, the fast push-off method 152 was applied.⁵⁴ The pressure calculated for the N = 200 153 polymer melt was $P^* = P\sigma_m^3/\epsilon_m = 4.864$ and was used to 154 perform the simulations of the nanocomposites in the NPT 155 ensemble. The R_g had reached a constant value with time. All 156 the polymers have a Gaussian conformation;⁵⁵ the ratio $\langle R_{ee} \rangle^2 / 157$ $\langle R_{\rm ee} \rangle^2 \approx 6.0-6.1$ (the mean-square internal distances are 158 shown in the Supporting Information). Details of the 159 nanocomposites modeled are given in Table 1. A snapshot of 160 ti a nanocomposite sample is depicted in Figure 2. 161 f2

Table 1. Nanorod Volume Fraction ϕ (%), Number of Nanorods N_n , and Diameter of Nanorods D (Measured in Units of the Monomer Size σ_m)



Figure 2. Polymer matrix with chains shown in gray and dispersed nanorods shown in blue.

The length of the simulation cell was larger than the end-to-163 end distance of the polymers, and it was confirmed that the 164 polymers do not interact with its periodic image. The Langevin 165 thermostat⁴⁶ was used to set the temperature at $T = k_{\rm B}T/\epsilon = 1$, 166 with a friction constant $\Gamma = 0.5\tau^{-1}$.^{19,56} As a reference, the glass 167 transition $(T_{\rm g})$ of a polymer model that contains a bending 168 potential (but not a torsional potential) is $T_{\rm g} = 0.4$.⁵⁰ The 169 Berendsen barostat was used, with time constant $\tau_{\rm p} = 2\tau$, to set 170 pressure at $P^* = 4.864$. The equations of motion were 171 integrated using the leapfrog algorithm⁵⁷ with a time step dt = 172 0.004 τ , where τ is the Lennard-Jones time.

173 In the next sections we investigate the effect of nanorod 174 diameter, aspect ratio, and polymer matrix on nanorod 175 diffusion and polymer dynamics.

III. RESULTS AND DISCUSSION

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A. Nanorod Structure. In this section we investigate the 177 dispersion of the nanorods⁵⁸⁻⁶³ into unentangled and 178 entangled polymer matrices in the dilute nanorod regime (ϕ 179 = 5%). The nanorod dispersion⁶⁴⁻⁶⁶ in a polymer matrix 180 depends on the polymer–nanorod interaction, and the best 181 dispersion state can be achieved at an intermediate interphasial 182 interaction.^{67,68} First we show in Figure 3 the intermolecular



Figure 3. Radial distribution function between the spheres of different nanorods in the polymer matrix.

183 nanorod-nanorod radial distribution function (RDF) (be-184 tween the spheres of the nanorod) of nanorods with diameter 185 D = 3 and AR = 8. (Similar behavior appears for nanorods of 186 the other nanocomposites studied, as is depicted in the inset of 187 Figure 3 for D = 4 and AR = 8.) It can been seen that there is 188 no peak with a value higher than the bulk value which appears 189 at a distance of $r \approx 8$. The monomer-nanorod RDF $g_{mp}(r)$ 190 exhibits a layering structure as is depicted in Figure 4. There is 191 a high monomer density around the nanorod which establish a 192 well-defined interface between nanorods and polymers. The 193 first peak of RDF in Figure 4 appears at contact distance



Figure 4. Radial distribution function between the monomers of the polymers and spheres of the nanorods.

between monomers and polymers which is $r = \frac{D + \sigma_m}{2}$. The 194 matrix length does not show any effect on the monomer 195 density around the nanorod. It has been seen that there is no 196 change in the polymer primitive path by the addition of $\approx 10\%$ 197 nanorod loading.⁶⁹

B. Nanorod Diffusion. The diffusion of nanorods in a 199 medium can be predicted by a Stokes–Einstein (SE) 200 continuum model.⁸ The diffusion coefficient $D_{\rm CT}$ of the 201 nanorod of diameter D in a fluid of viscosity η is given by^{7,8,68} 202

$$D_{\rm CT} = \frac{T^*}{3\pi\eta^* L^*} \ln(L^*/D^*) \tag{6}_{203}$$

where $\eta^* = \frac{\eta \sigma_m^3}{k_B T \tau}$ is the viscosity of the polymer matrix, $D^* = \frac{204}{D/\sigma_m}$, and $L^* = L/\sigma_m$. The simulated viscosities of the polymer 205 melts are given by ref 70 and for long polymers (N = 200, 400) 206 by ref 71. The nanorod diffusivity can be calculated from the 207 mean-square displacement (MSD) measurements of the beads 208 of the spherocylinder⁷² and is given by 209

$$D_0 = \frac{1}{6} \lim_{t \to \infty} \frac{\mathrm{d}}{\mathrm{d}t} \langle |\mathbf{r}_i(t) - \mathbf{r}_i(0)|^2 \rangle \tag{7}_{210}$$

where $\langle |\mathbf{r}_i(t) - \mathbf{r}_i(0)|^2 \rangle$ is the time-dependent displacement of 211 the beads of spherocylinder averaged over time and particles of 212 the ensemble (\mathbf{r}_i is the position of a particle *i*). 213

The diffusion of thin nanorods reaches a plateau for $N \ge 214$ 100 (entangled polymer matrices), as depicted in Figure 5, in 215 f5 agreement with the GLE theory^{12,15} and by de Gennes, 24,73 216 who claimed that bulk viscosity does not capture the behavior 217 of the medium near nanoparticles, and thus the nanoparticles 218 diffusion is decoupled from the SE formula (eq 6). Because the 219 nanorod diameter is smaller than the entanglement mesh, the 220 nanorods can diffuse faster in comparison to the SE theoretical 221 predictions due to local viscosity.^{15,74,75} A qualitative similar 222 plateau regime in entangled matrices appears for spherical 223 nanoparticles, where nanoparticle diffusivity approaches the 224 Stokes-Einstein predictions when the diameter of the 225 nanoparticle is approximately 2-3 times the matrix tube 226 diameter, as was evidenced in poly(n-butyl methacrylate)/gold 227 composites,^{76,77} fullerene/polystyrene composites,⁷⁸ and the- 228 oretical studies.^{74,79,80} However, in entangled poly(2-vinyl- 229 pyridine) (P2VP)/nanosilica composites (where attractive 230 polymer-nanoparticle interactions are present), nanosilica 231 diffusion in P2VP is well-described by the Stokes-Einstein 232 formula, since $2R/d_T = 3$. In addition, the diffusivity of the 233



Figure 5. Dependence of nanorods diffusivity in unentangled and entangled polymer matrices of different diameter: spherical nanoparticles of diameter D = 2 (circles),¹⁹ nanorods of D = 1, AR = 16 (diamonds), nanorods of D = 2, AR = 8 (squares), nanorods D = 3, AR = 8 (down triangles), nanorods of D = 4, AR = 8 (stars). Tube diameter of polymer model: $d_{\rm T} = 9.7\sigma_{\rm m}$. Tube diameter of PS: $d_{\rm T} = 8$ nm.

234 nanorods decreases with AR as is depicted in Figure 5 for $2R/235 d_{\rm T} = 0.1$.





Figure 6. Dependence of scaled nanorods diffusivity in unentangled and entangled polymer matrices for different nanorod diameters: spherical nanoparticles of diameter, D = 2 (circles),¹⁹ nanorods of D = 1, AR = 16 (diamonds), nanorods of D = 2, AR = 8 (squares), nanorods D = 3, AR = 8 (down triangles), nanorods of D = 4, AR = 8 (stars), experiments (stars).¹⁰

238 6). In the dilute nanorod regime ($\phi = 5\%$) thin nanorods (D = 239 2) diffuse faster than the SE prediction¹⁵ for matrices $N \ge 50$ 240 ($N/N_e > 1$). In nanocomposites containing an unentangled 241 polymer matrix simulation data agree with experiments.¹⁰ It 242 can be seen that such nanorods, thinner than the tube diameter 243 d_T ($d_T \approx 9.7\sigma_m$ for our polymer model), deviate more from the 244 SE predictions with increasing *M*. The discrepancy is larger for 245 entangled polymer matrices due to the viscosity scaling with 246 molecular weight $\eta \propto N^{3.4}$ in the entangled regime.

Nanorod diffusivity decreases, as can be seen in the Figure 5, 248 if *D* increases and the scaled diffusivity value approaches more 249 the experimental data as is depicted in Figure 6. The 250 discrepancy between the simulation and experimental data in 251 the entangled polymer matrices might come from the thinner 252 nanorods that were used in the simulations. It has been shown 253 by simulations²² that nanoparticles of diameter $D \ge d_T$ do not 254 follow the plateau diffusivity regime in entangled polymer matrices, but its diffusivity rather decreases with polymer 255 molecular weight. 256

Furthermore, we calculated the displacement distribution of 257 the nanorods at different times by obtaining the self-part of the 258 van Hove function (VHF) 259

$$G_{\rm s}(r,\,\Delta t) = \left\langle \delta[r - |\mathbf{r}_i(t_0 + \Delta t) - \mathbf{r}_i(t_0)|] \right\rangle_{t_0} \tag{8}_{260}$$

which gives the probability distribution to find a nanoparticle 261 at a distance r from the initial position (at time t_0) after a time 262 interval Δt . The probability is normalized as $\int G_s(r,\Delta t) d^3r = 1$. 263 As can be seen from Figure 7, at small time intervals 3000τ and $_{264 \text{ fr}}$ 15000 τ , the data can be fitted to a single Gaussian function (eq 265 9) with a peak value corresponding to the most probable 266 traveled distance during that time interval Δt . However, at long 267 time scales (diffusive regime) a bimodal function is necessary 268 to model the displacement of the nanoparticles in the polymer 269 matrix. Moreover, for thinner rods of D = 1 (or D = 2), even at 270 short time scales of 3000τ , a non-Gaussian dynamics is 271presented as can be seen in Figure 7d-f (see also Figure S9). 272 This denotes a hopping fashion of motion of the nanorods 273 (similar behavior of the van Hove functions in other 274 nanocomposite systems is shown in the Supporting Informa- 275 tion). 276

$$G_{\rm s}(r,\,\Delta t) = (4\pi D\Delta t)^{-3/2} {\rm e}^{-r^2/4D\Delta t}$$
(9) 277

In previous simulation studies (both atomistic^{6,81} and coarse $_{278}$ grained^{37–39}) it was shown that even small nanoparticles (such $_{279}$ as fullerene) smaller than the entanglement mesh can follow a $_{280}$ hopping type of motion in a polymer matrix. $_{281}$

C. Polymer Dynamics. In polymer-nanorod compo- 282 sites,⁸² the nanorods act as extra entanglements⁸³ that can alter 283 the polymer primitive path $^{83-85}$ and thus the polymer 284 dynamics.⁹ It has been observed that in nanocomposites that 285 contain attractive polymer/nanoparticle interaction, such as 286 nanosilica/poly(ethylene glycol) (PEO) or poly(butylene 287 oxide) (PBO) mixtures,⁸⁶ polymer dynamics is affected by 288 the nanoparticles,⁸⁷ especially in nanoparticle loading larger 289 than the dilute regime (ϕ = 5%). By increasing the nanorods 290 loading in the matrix, the interphase around the nanorods 291 would increase since more monomers exist into the 292 interphasial area.⁸⁸ Figure 8 shows the mean-square displace- 293 f8 ment (MSD) of unentangled polymers in melts and nano- 294 composites containing different nanorods. It can be seen that 295 on long time scales the polymer dynamics (diffusion) is lower 296 in nanocomposites. The discrepancy in the polymer MSD 297 between melts and nanocomposites is higher for the oligomers 298 (N = 10, 20) due to more monomers that are in contact with 299 nanorod surface. Recently, it was shown in experiments that 300 tracer (polymer) diffusion can be enhanced by the mobility of 301 nanorods relative to the case of immobile nanorods.⁸⁹ In 302 addition, in nanocomposites containing nanosilicas (tethered 303 with poly(ethylene glycol) chains) in a poly(methyl meth- 304 acrylate) (PMMA) matrix, PMMA dynamics undergoes a 305 continuous transition from a bulklike behavior at low loading 306 to a confinement behavior at intermediate loading and 307 eventually to glassy behavior at high loading.⁹⁰ The mechanism 308 of polymer diffusion reduction in those experimental and our 309 simulation data is due to nanoparticle interfacial area^{88,91,92} 310 and not due to entropic barriers. 311



Figure 7. van Hove function $G_s(r,\Delta t)$ for nanorods in nanocomposite, nanorod diameter D = 3, AR = 8, polymer matrix N = 200 (blue squares), nanorod diameter D = 1, AR = 16, polymer matrix N = 200 (blue diamonds) at three different Δt . Symbols are simulation data and solid lines are fitting of eq 7 in the first two panels (a) + (b) for $\Delta t \le 15\tau$, while the right panel (d) for larger time interval $\Delta t = 90\tau$ can only be fitted by a superposition of two Gaussians. The individual contributions are shown by black dashed lines.



Figure 8. Polymers mean-square displacement of different molecular weights. Solid lines: melts; dashed lines: nanocomposites of D = 4, AR = 8; dotted lines: nanocomposites of D = 3, AR = 8.

IV. CONCLUSIONS

312 Nanorod diffusion and polymer dynamics in nanocomposites 313 were investigated by means of coarse-grained molecular 314 dynamics simulations. We showed that thin nanorods can 315 diffuse faster than the prediction of the Stokes-Einstein 316 continuum model in entangled matrices. The simulated data 317 predict the nanorod diffusion in agreement with experiments in 318 unentangled matrices but overpredict the nanorod diffusion in 319 entangled polymer matrices. The nanorods follow a hopping 320 type of motion in the polymer matrix. In addition, we have 321 found that nanorods hinder polymer chains motion, even at a 322 dilute nanorod loading.

ASSOCIATED CONTENT	323
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