



### Molecular Simulation of the Shape Deformation of a Polymersome

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ARTICLE

## Molecular Simulation of the Shape Deformation of a Polymersome

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Vesicles composed of diblock copolymers, or polymersomes, have proven to possess numerous applications ranging from drug delivery to catalytically driven nano-motors. The shape of a polymersome can be responsive to external stimuli, such as light or solvent. Molecular dynamics simulations reveal that the shape change upon the contraction of the inner volume of a polymersome vesicle occurs in two separate regimes—a stretching regime and a bending regime. The barrier is shown to be dependent on the solvent environment. These results suggest that tailoring the bending modulus of polymer membranes can be used as a design methodology to engineer new stimuli-responsive vesicles.

### 1 A. Introduction

2 “Polymersomes” are diblock copolymer membranes that form  
3 vesicle shape in solution <sup>1,2</sup>. Due to their high molecular weight,  
4 polymer vesicles as compared with phospholipid vesicles possess a  
5 higher mechanical rigidity and a lower water permeability <sup>3</sup>. For  
6 example, phospholipid membranes can possess a bending rigidity  
7 approximately in the range of  $0.2\text{--}1.3 \times 10^{-19}$  J ( $\sim 5\text{--}30$  k<sub>B</sub>T)  
8 while diblock copolymer membranes have a bending rigidity that can  
9 range from approximately  $1.3\text{--}20.0 \times 10^{-19}$  J ( $\sim 30\text{--}500$  k<sub>B</sub>T).  
10 The inherent hydrophobicity and thickness of polymer membranes  
11 ( $\sim 4\text{--}15$  nm) as compared with phospholipid membranes ( $\sim 4$  nm)  
12 imparts a selective permeability to polymer membranes. This solvent  
13 selectivity can be harnessed to engineer and fine-tune membranes  
14 and polymersomes that are responsive to solvent concentration to  
15 form unique shapes. Stimuli-responsive polymersomes have diverse  
16 materials applications as nanocarriers <sup>6,7</sup>, nanoreactors <sup>8</sup>, and even  
17 as biomimetic systems <sup>9,10</sup>.

18 Besides the equilibrium spherical geometry,  
19 polymersomes often deform to form a range of shapes including  
20 disco-cytes, dumbbells, pear-shaped vesicles, and stomatocytes,  
21 dependent on the surrounding environment <sup>11</sup>. These shape  
22 transformations are generally induced by a change in the osmotic  
23 conditions surrounding a membrane, leading to a balance between  
24 the change in internal concentration of the membrane (osmotic  
25 pressure) and its bending energy <sup>12</sup>. The free energy of fluid, non-  
26 crystalline membranes in vesicular shapes has contributions due to  
27 the bending rigidity,  $\kappa$ , and the Gaussian bending rigidity,  $\kappa_G$ , plus an

28 osmotic pressure difference inside and outside the membranes, as  
29 well as the surface tension <sup>12,13</sup> as follows:

$$F = \int (f_c + \gamma) dA + \Delta p \int dV$$

30 where  $f_c = \frac{\kappa_c}{2} (2H + c_0)^2 + \kappa_G K$  and  $c_0$  is the spontaneous  
31 curvature,  $H$  is the mean curvature, and  $K$  is the Gaussian curvature  
32 of the membrane. The equilibrium shape of a spherical bilayer was  
33 shown by Ou-Yang and Helfrich <sup>13</sup> to satisfy the following equation:  
34

$$\Delta p - 2\gamma H + \kappa(2H + c_0)(2H^2 - c_0H - 2K) + 2\kappa\nabla^2 H = 0$$

35 The threshold pressure for instability was shown to be  $\Delta p_C \propto \kappa/R^3$ ,  
36 where  $R$  is the radius of the vesicle. The elastic properties of  
37 polymersomes, such as the membrane bending and area expansion  
38 moduli can be tuned based on the unique diblock copolymer  
39 compositions, with well-known scaling relations <sup>14</sup>. For example, the  
40 area expansion modulus,  $K_A$ , for block copolymer membranes is  
41 determined by the strength of the interfacial tension,  $K_A \sim 4\gamma$ , which  
42 varies with respect to polymer chemistry and environment <sup>14,15</sup>. The  
43 interfacial tension and thus the area elastic modulus can be tuned  
44 through cross-linking one of the components <sup>16</sup> or blending the  
45 membrane with an additional copolymer or surfactant of different  
46 molecular weight <sup>10,17</sup>. The bending modulus has been  
47 experimentally shown to scale with the thickness of the membrane,  
48  $\kappa \sim K_A d^2$  <sup>5</sup>.

49 Common copolymer chemistries that form polymersomes  
50 include copolymers such as poly(ethylene oxide)–polystyrene  
51 (PEO-PS) and PEO-poly(ethylene glycol) (PEG) <sup>2</sup>. In addition, polyester  
52 based copolymers with biodegradable hydrophobic segments such  
53 as poly caprolactone (PCL) and polylactic acid (PLA) have also been  
54 shown to form these functional assembled membranes, oftentimes  
55 used with blends of inert copolymers such as PEO-polybutadiene  
56 (PEO-PBD) to modulate degradation and release profiles <sup>3</sup>. While  
57 morphologies and characteristics of PS-based vesicles have  
58 previously been characterized in great detail <sup>18,19</sup>, recently, there has  
59 been a revived interest in glassy polymersomes <sup>20</sup>. For example, as  
60 shown by Kim et al <sup>21</sup>, dependent on the water and solvent  
61 concentration inside and outside of the membrane, these vesicles  
62 can be inflated or deflated as the osmotic pressure difference varies.  
63 Furthermore, Wilson et al <sup>8,11,22-24</sup> showed that during dialysis  
64 against water, after preparing a PEO-PS polymersome in a mixture of  
65 water and organic solvents, induces an osmotic pressure difference

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1 between inside and outside of the polymersome membrane and  
 2 transforms the spherical geometry to a stomatocyte. In particular,  
 3 the formation of the stomatocyte occurs in a region given by a range  
 4 of reduced volumes and reduced areas of the inner compartment of  
 5 the polymersome as compared to the ideal spherical shape<sup>12, 25</sup> due  
 6 to rapid outward diffusion of the organic solvent during dialysis. The  
 7 degree of shape deformation is found to be correlated to the amount  
 8 of cosolvent in the mixture<sup>21</sup>. Before reaching the stomatocyte  
 9 conformation, the polymersome forms a series of non-spherical  
 10 structures ranging from prolate to disk<sup>11</sup>.

11 While continuum models have been long been utilized to  
 12 predict non-spherical topologies of fluid membranes and vesicles  
 13<sup>26</sup>, the use of particle-based methodologies including such methods  
 14 as Monte Carlo, Dissipative Particle Dynamics (DPD), and molecular  
 15 dynamics to characterize the shape transformation and/or stability  
 16 of polymer vesicles are ongoing<sup>27, 28</sup>. One constraint in utilizing  
 17 particle-based models to predict the materials properties of polymer  
 18 assemblies is the accuracy and thus the predictive power of the  
 19 polymer force field<sup>29</sup>. Computational models of PS and additives  
 20 possess a long history<sup>30-32</sup> with PS increasingly well-studied by both  
 21 all-atomistic<sup>33</sup> and CG molecular dynamics simulations<sup>34</sup>. Numerous  
 22 molecular-based models for PS have been developed, utilizing both  
 23 structural<sup>34</sup> and thermodynamic<sup>35</sup> mapping methodologies<sup>36</sup>. We  
 24 have designed a CG model for PS based on all-atomistic simulations  
 25<sup>37</sup> that is compatible with the CG model for PEO developed by  
 26 Shinoda et al<sup>36</sup>. The CG water model is also developed by Shinoda  
 27 et al<sup>36</sup>. The PS model was first characterized to show the correct  
 28 scaling behavior for the radius of gyration of the polymer as a  
 29 function of molecular weight in a poor solvent (water)<sup>37</sup>. Next, the  
 30 PEO-PS force field was utilized to characterize the nature of glassy  
 31 worm-like and spherical micelles<sup>38</sup>. Herein, we extend this coarse-  
 32 grain force field for PEO-PS diblock copolymers of certain amphiphilic  
 33 fraction to characterize the elastic properties ( $K_A$  and  $\kappa$ ) of PEO-PS  
 34 diblock copolymer membranes. We show that PEO-PS membranes  
 35 exhibit an expected  $K_A$  and  $\kappa$ , consistent with experimental  
 36 measurements. We demonstrate that expected  $K_A$  is independent  
 37 of the length of the copolymer, for low copolymer weights at a  
 38 certain hydrophilic fraction. For the shortest copolymer, we  
 39 characterize and predict  $\kappa$  and show that this rigidity decreases with  
 40 incorporation of a model hydrophobic solvent. We next utilize this  
 41 model to characterize perturbations to the structure of nearly  
 42 micron-sized polymersomes and explore the process of shape  
 43 deformation. We find two different regimes in the shape change of  
 44 these model PEO-PS vesicles, the first dominated by stretching of the  
 45 membrane and reorientation of the polymer chains, the second  
 46 regime dominated by the splaying of the polymer chains.

47 We develop a simple algorithm to accelerate the process  
 48 of diffusion of the solvent from the inner compartment by gradually  
 49 moving water from inside of the polymersome to outside in multiple  
 50 cycles. After each cycle the simulation is run long enough for the  
 51 polymersome shape to equilibrate, approximately 50 ns. The inner  
 52 volume of the polymersome shape changes upon removal of the  
 53 water, and, as a result, the polymer vesicle forms a non-spherical  
 54 shape. The shape change undergoes two major structural  
 55 rearrangements of the polymer bilayer membrane. First, the  
 56 hydrophobic core stretches longitudinally. Next, this is followed by  
 57 the bending and crumpling of the membrane inward. The free  
 58 energy analysis of the shape change of the polymersome calculated  
 59 with Umbrella Sampling<sup>39</sup> further reveals that the stretching and the  
 60 bending regimes of PEO-PS membrane are separated by a high  
 61 energy barrier on the order of 20 kcal/mol.

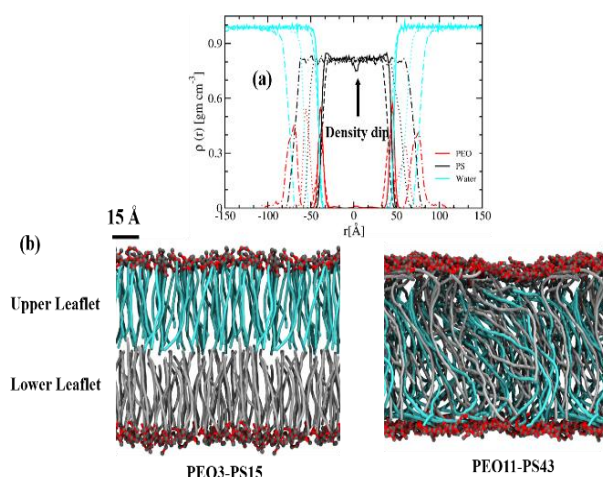
## B. Methods

Due to the large system size and longer time scales involved in these PEO-PS membrane and polymersomes, coarse-grained (CG) based molecular dynamics simulation (CG-MD) is the ideal methodology to study the self-assembly of di-block co-polymers like PEO-PS. CG models have been routinely used to study self-assembly of different biological, as well as synthetic soft materials, including polymers, peptides, proteins, and membranes in science and engineering<sup>40-45</sup>. The CG parameters for PS are developed by *Drensko et al.*<sup>37</sup>, based on a Shinoda-DeVane-Klein (SDK)<sup>46</sup> coarse-graining approach. The parameters for PEO and water are developed by the Klein group<sup>44, 47, 48</sup>. Intra-molecular interactions in the SDK model are calculated via harmonic potentials given by  $V_{\text{bond}}(r) = K_b(r - r_0)^2$  and  $V_{\text{angle}}(\theta) = K_a(\theta - \theta_0)^2$ , respectively. Here,  $K_b$  and  $r_0$  are the equilibrium force constant and distance for bond stretch, and  $K_a$  and  $\theta_0$  are the equilibrium bending force constant and equilibrium value for angles. Non-bonded interactions are set by a pair-wise additive potential based on the Lennard-Jones (LJ) potential:  $U_{LJ9-6} = (27/4)\epsilon\{(\sigma/r)^9 - (\sigma/r)^6\}$  or  $U_{LJ12-4} = (3\sqrt{3}/2)\epsilon\{(\sigma/r)^{12} - (\sigma/r)^4\}$ <sup>49</sup>. Cross-interactions between the PEO and PS are estimated assuming a combination rule between the PEG-CG bead,  $i$ , and PS CG group,  $j$ , where  $\epsilon_{ij} = (\epsilon_{ii}\epsilon_{jj})^{1/2}$  and  $\sigma_{ij} = (\sigma_{ii} + \sigma_{jj})/2$ . We have previously tested these CG parameters for PEO-PS worm micelles<sup>38</sup>. Here, we use a model weakly hydrophobic bead to mimic the fluidizing effect of solvent on the shape transformation of a polymersome. The solvent LJ parameters, both  $\epsilon$  and  $\sigma$ , are the same as the interfacial bead of the PEO-PS polymer, as defined in **SI Table 1**.

To test this model further, four different CG bilayer membranes with polymer chain lengths PEO<sub>3</sub>-PS<sub>15</sub>, PEO<sub>11</sub>-PS<sub>43</sub>, PEO<sub>16</sub>-PS<sub>64</sub>, and PEO<sub>22</sub>-PS<sub>86</sub> are simulated in an aqueous medium. All of the bilayers contain 100 polymers and 100,000 water molecules. The total number of beads in each system varies between 150,000-200,000. 100 ns trajectories are generated for each bilayer system with the time step of 10 fs. All simulations are performed under NPT conditions at 300 K and 1 atm using LAMMPS<sup>50</sup> using Nose-Hoover thermostat<sup>51</sup> using the equations of motion from Shinoda et al<sup>52</sup> and Parrinello-Rahman barostat<sup>53</sup> and the equations of motion of Martyna et al<sup>54</sup>. In addition to the bilayer membranes, we also equilibrated two small polymersomes with polymer chain lengths PEO<sub>3</sub>-PS<sub>15</sub> and PEO<sub>11</sub>-PS<sub>43</sub>. Each system contains 1300 polymers and 400,000 water molecules. The total number of CG beads for PEO<sub>3</sub>-PS<sub>15</sub> and PEO<sub>11</sub>-PS<sub>43</sub> polymersomes are around 500,000 and 700,000 respectively. Finally, a large polymersome with diameter around 40 nm is setup. The system contains 10,300 PEO<sub>3</sub>-PS<sub>15</sub> polymers and 1,090,000 water molecules. Altogether it has 1,759,500 beads. 100 ns trajectories are generated for each polymersome under NPT conditions.

### Umbrella Sampling.

To construct the free energy profile for the shape change of the PEO-PS polymersome due to contraction of inner compartment, we used umbrella sampling (US) techniques<sup>55</sup> for efficient sampling. The reaction coordinate for the US is the radius of gyration of the inner leaflet ( $r_{g_i}$ ) of the polymersome. A harmonic potential,  $\frac{1}{2}k(r_{g_i} - r_{g_i}^0)^2$ , was employed during simulation. Here, the force constant  $k = 2 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$  and  $r_{g_i}^0$  is the reference radius of gyration of the inner leaflet. The initial configuration of 20 different cycles are



**Fig 1.** (a) Density profile of PEO<sub>3</sub>-PS<sub>15</sub> (solid line), PEO<sub>11</sub>-PS<sub>43</sub> (dashed line), PEO<sub>16</sub>-PS<sub>64</sub> (dotted line), and PEO<sub>22</sub>-PS<sub>86</sub> (dot-dashed line) membranes. Hydrophilic fraction is constant. (b) Snapshot after 100 ns simulation of a CG-ed model of a PEO-PS diblock copolymer membrane, specifically PEO<sub>3</sub>-PS<sub>15</sub> and PEO<sub>11</sub>-PS<sub>43</sub>. PEO is grey and red, PS is cyan (upper leaflet) and silver (lower leaflet).

- 1 chosen as 20 individual reference points for US simulations. For each
- 2 window we performed 30 ns simulation. Finally, to obtain the
- 3 potential of mean force (PMF) as a function of  $r_{gi}$  we used the
- 4 weighted histogram analysis method (WHAM)<sup>56, 57</sup>.

## 5 C. Results and Discussion

### 6 Properties of Membrane.

7 To begin with, to validate the PEO-PS force field, we utilize long-time

8 coarse grain molecular dynamics (CG-MD) to characterize structural

9 and mechanical properties of PEO-PS bilayers with increasing

10 copolymer chain lengths at the same hydrophilic fraction. Due to the

11 slow dynamics of the long PS chains, as investigated and

12 characterized for PEO-PS spherical and cylindrical micelles<sup>58</sup>, we do

13 not characterize the self-assembly of bilayers at this time. However,

14 we note that approaches such as MC with implicit solvent could be

15 an alternative approach to equilibrate these systems<sup>59</sup>. We simulate

16 four different CG bilayer membranes with varying copolymer chain

17 lengths PEO<sub>3</sub>-PS<sub>15</sub>, PEO<sub>11</sub>-PS<sub>43</sub>, PEO<sub>16</sub>-PS<sub>64</sub>, and PEO<sub>22</sub>-PS<sub>86</sub>, composed

18 by EO<sub>*m*</sub>-PS<sub>*n*</sub>, where  $m = N_{EO}$  and  $n = N_{PS}$  are the indicated number of

19 monomers. Bilayer membranes were made, keeping constant the

20 hydrophilic monomer fraction,  $f_{EO} \sim 1$ , where  $f_{EO} = m_{EO}N_{EO}/$

21  $(m_{EO}N_{EO} + m_{PS}N_{PS})$ , consistent with the vesicle phase.

### 24 Structural Properties of Membrane.

25 Along with water, the average density profiles of both PEO and PS

26 along the normal to the bilayer plane are highlighted in **Figure 1(a)**.

27 Irrespective of polymer chain length, a narrow density profile of PEO

28 suggests a sharp interface between the hydrophobic PS core of the

29 membrane and hydrophilic PEO. In addition to the interface, the

30 profile further reveals a density dip near the center of the bilayers

31 for the shortest polymer chain length (PEO<sub>3</sub>-PS<sub>15</sub>). A similar density

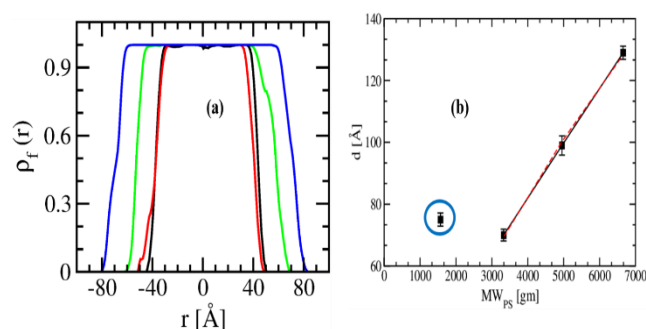
32 dip was also reported previously<sup>60</sup> between the two leaflets of a lipid

33 bilayer as well as a polymer membrane with small chain lengths. As

34 the membrane becomes thicker with increasing polymer chain

35 length, the density dip disappears and a localized density of PS near

36

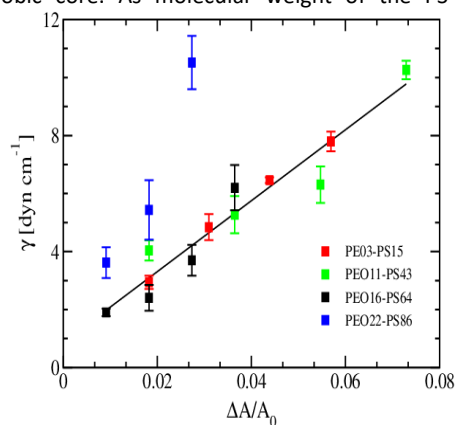


**Fig 2.** (a) Variation of density fraction of PS ( $\rho_f$ ) from the center of PEO-PS membrane with four different chain lengths. Black line for PEO<sub>3</sub>-PS<sub>15</sub>, red for PEO<sub>11</sub>-PS<sub>43</sub>, green for PEO<sub>16</sub>-PS<sub>64</sub>, and blue for PEO<sub>22</sub>-PS<sub>86</sub>. (b) Scaling of the membrane core thickness,  $d$ , as a function of  $MW_{phob}$ ,  $d \sim MW_{phob}^{0.589}$ .

the center with a plateau value of  $0.8 \text{ g cm}^{-3}$  is observed. This again agrees well with previous simulation studies<sup>61, 62</sup> of diblock copolymer membranes. In **Figure 1(b)**, we present the final snapshots of PEO<sub>3</sub>-PS<sub>15</sub> and PEO<sub>11</sub>-PS<sub>43</sub> membranes after 100 ns. The two leaflets of each membrane are shown in different colors. In agreement with the density dip, the snapshot depicts very little or nearly no overlap between the two leaflets of the PEO<sub>3</sub>-PS<sub>15</sub> membrane. In contrast, for the PEO<sub>11</sub>-PS<sub>43</sub> membrane, the PS polymer chain ends interpenetrate within the hydrophobic core. Hence, due to the overlap of the leaflets, the density dip disappears for long copolymer chain lengths.

### Scaling With Molecular Weight.

The width of the membrane also depends on the melting of its two leaflets. Mean field arguments of the strong segregation limit (SSL) predict the width of the hydrophobic core,  $d \sim N_h^{2/3}$ , where  $N_h$  is the length of the hydrophobic polymer in the bilayer/vesicle phase. For fully stretched chains,  $d \sim N_h$ , while for ideal chains,  $d \sim N_h^{1/2}$ . Experimentally, for the case of PEO-PBD, as well as computationally via mesoscopic simulation techniques<sup>61</sup>, for the case of PEO-PEE, the scaling has been found to be close to the ideal random chain<sup>14</sup>. To compute the width of the hydrophobic core, we calculate the density fraction of PS ( $\rho_f$ ) as a function of distance from the central core region.  $\rho_f$  is defined as  $\frac{\rho_{PS}}{\rho_{PS} + \rho_{PEO}}$ . Variation of  $\rho_f$  against normal to the bilayer plane are highlighted in **Figure 2(a)**. Any regions with  $\rho_f$  greater than 0.8 are considered as a part of the membrane hydrophobic core. As molecular weight of the PS ( $MW_{phob}$ ), is



**Fig 3.** Surface tension vs area of expansion of PEO-PS bilayers. The slope leads to an estimate of the area elastic modulus,  $K_A$ , of approximately 125  $\text{dyne/cm}$ . Each simulation was run for 20.0 ns.

1 proportional to the length of the hydrophobic polymer,  $N_h$ , in **Figure 2**  
 2 **2(b)**, we have shown the variation  $d$  for a range of  $MW_{\text{phob}}$ . **Table 1**  
 3 thickness of the bilayer for higher molecular weights is given by the  
 4 relation,  $d \sim MW_{\text{phob}}^{0.589}$ , which is close to the ideal random chain  
 5 limit. This is also consistent with previous experiments<sup>14</sup> and recent  
 6 simulation studies<sup>62</sup> for PEO- PBD membranes. However, for the  
 7 lowest molecular weight (PEO<sub>3</sub>-PS<sub>15</sub>), the width of the hydrophobic  
 8 core deviates from the ideal random chain limit. For the lower  
 9 molecular weights, less entropic force is needed to stretch the  
 10 chains, which causes them to more tightly pack, as they deviate from  
 11 the ideal configuration of the random chain. This naturally leads to  
 12 less interpenetration as the chains approach the brush limit.

## 14 Mechanical Properties

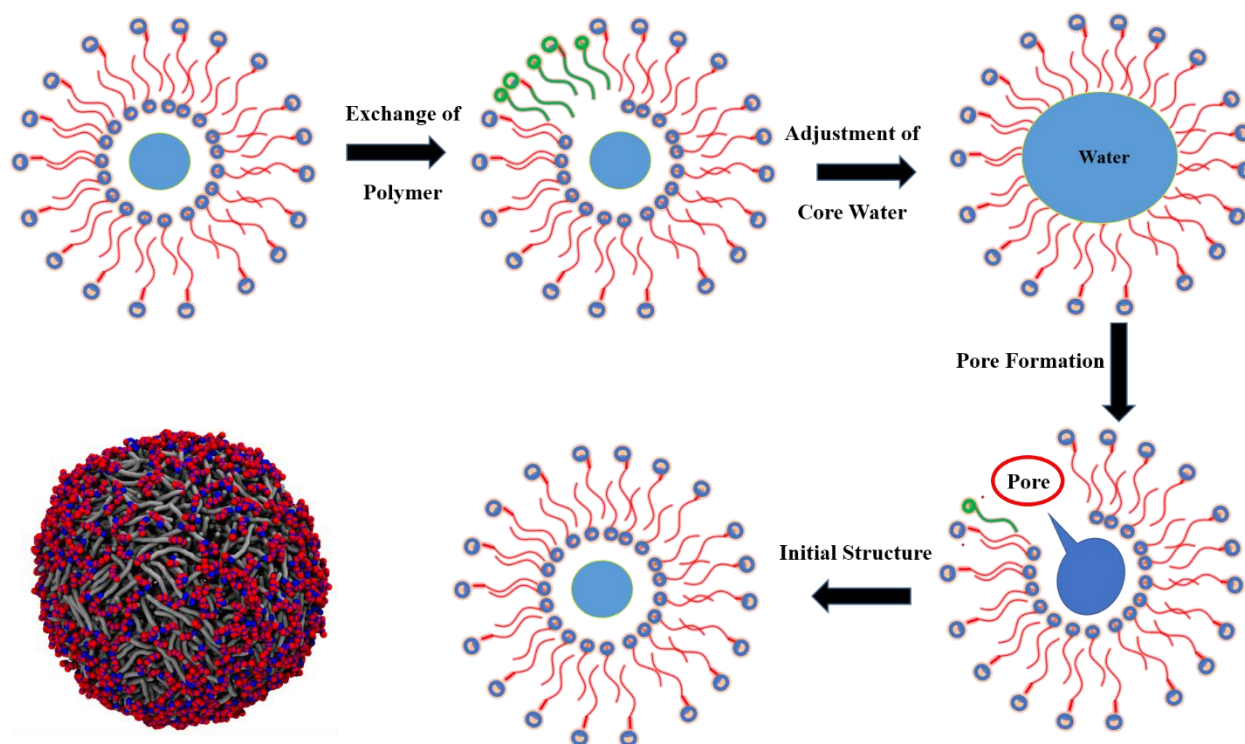
15 To study the elastic properties of the bilayer, we next calculate the  
 16 membrane area elasticity for PEO-PS diblocks for a range of  
 17 molecular weights. Considering similar values of Hildebrand  
 18 solubility coefficients for PS and polybutadiene (PBD), the interfacial  
 19 tension between PEO and PS,  $\gamma_{\text{PEO-PS}}$  is expected to be similar to PEO  
 20 and PBD,  $\gamma_{\text{PEO-PBD}} = 26$  mN/m. From the interfacial tension one can  
 21 estimate the area elastic modulus,  $K_A = 4\gamma_{\text{interface}} = 102$  mN/m, which  
 22 is predicted to be independent of the molecular weight of the  
 23 polymer. We make a simple computational estimate of  $K_A$  for a PEO-  
 24 PS bilayer membrane from the slope of the tension ( $\gamma$ ) vs. area

Chain Length	$K_A$ [dyne cm <sup>-1</sup> ]	$A_0$ [Å <sup>2</sup> ]
PEO <sub>3</sub> -PS <sub>15</sub>	129.6 (±2.3)	76.2 (± 0.2)
PEO <sub>11</sub> -PS <sub>43</sub>	118.1 (±5.1)	241.3 (± 0.8)
PEO <sub>16</sub> -PS <sub>64</sub>	122.2 (±4.5)	253.7 (± 0.9)
PEO <sub>22</sub> -PS <sub>86</sub>	378.5 (±10.6)	262.1 (± 0.4)

**Table 1:** Area elastic modulus ( $K_A$ ) and area per polymer ( $A_0$ ) of PEO-PS membranes with varying molecular weight.

25 expansion,  $\Delta A/A$ , for a given set of diblock lengths. To do so, we  
 26 stretch each membrane gradually along the  $xy$ -plane from its  
 27 equilibrium structure (zero surface tension). After each stretching,  
 28 we equilibrate the membrane for 5 ns followed by a 20 ns production  
 29 run. The final configuration of each production run is used as the  
 30 starting configuration for the next simulation of the membrane with  
 31 increased area. We determine  $\gamma$  by using the formula,  $\gamma = \langle (L_z/2) [(P_{zz}$   
 32  $- (P_{xx} + P_{yy})/2)] \rangle$ , where  $P_{ij}$  is the  $ij$  component of the pressure tensor  
 33 and  $L_z$  is the box length along the  $z$ -axis. The calculations of  $\gamma$  along  
 34 each of the trajectories have been carried out by averaging over 4  
 35 different blocks each with 5 ns duration, using a block averaging  
 36 approach. The variations of  $\gamma$  due to stretching for all four  
 37 membranes with different polymer chain lengths are shown in **Figure**  
 38 **3**. Irrespective of chain length, artificially stretching the membrane  
 39 shows an increase in surface tension. A close comparison between  
 40 the membranes further suggests that for the longest chain length  
 41 (PEO<sub>22</sub>-PS<sub>86</sub>), the increment in surface tension with increasing surface  
 42 area is relatively higher compared to other membranes. Due to  
 43 higher  $\gamma$  values, to estimate the area average elastic modulus,  $K_A$ , we  
 44 calculate the slope of surface tension vs. area expansion without  
 45 considering the data for PEO<sub>22</sub>-PS<sub>86</sub>. The average  $K_A$  is found to be  
 46 around 125 dyne/cm or 125 mN/m, which is close to the initial  
 47 theoretical estimate of 102 mN/m. In addition, a  $K_A \sim 120$  mN/m has  
 48 been also reported for polyethylene oxide – polyethylene (PEO-  
 49 PEE) polymersomes. In **Table 1** we also present results of estimated  
 50  $K_A$ 's and equilibrium area per polymer chain  $A_0$  for four different  
 51 lengths of PEO-PS diblocks. These measurements are performed by

fitting the data points for individual membranes. While  $K_A$  is not  
 predicted to be dependent on the molecular weight of the polymer,  
 here initial results suggest an increase at higher diblock copolymer  
 lengths, which is contrary to previous findings and is likely an artifact  
 due to limited sampling, especially considering the long molecular



**Fig 4.** Schematic representations of the four steps to get a well equilibrated preassembled polymersome structure. The first step is the exchange of polymers between the inner and outer leaflets. The second step is the adjustment of water inside the inner core of the polymersome. In the third step, the polymersome adjusts water number inside the polymersome by forming multiple pores. Finally, we find the well-equilibrated starting structure of the polymersome. The blue circles represent the hydrophilic PEO, while the red lines represent the hydrophobic PS.

1 weight of the PS. This needs to be further tested. The computational  
 2 measurements as shown in **Figure 3** are made using one initial  
 3 membrane conformation, and calculating the interfacial tension for  
 4 four different initial membrane areas over 20 ns simulation time.  
 5 More accurate measurements and a better calculation of error can  
 6 be estimated through averaging over several initial membrane  
 7 conformations, as well as a greater sampling of initial membrane  
 8 areas.  
 9  
 10 **Polymersome Simulations.**

## 11 Preparation of Initial Structure.

12 Next, we set up three pre-assembled PEO-PS polymersomes  
 13 structure with two different polymer chain lengths PEO<sub>3</sub>-PS<sub>15</sub> and  
 14 PEO<sub>11</sub>-PS<sub>43</sub>. For each case six different trials are performed, holding  
 15 the number of polymers and the initial core radius of the  
 16 polymersome constant and varying the number of polymers in the  
 17 inner and outer leaflets, as well as the concentration of water in the  
 18 center of the polymersome to set up an equilibrium starting  
 19 conformation. Detailed steps are shown in **Figure 4**. First, we start  
 20 with equal number of polymers (650 for small and 5150 for big  
 21 polymersomes) (based on the surface area of the inner core) in the  
 22 inner and outer leaflets of the polymersome. As the initial system is  
 23 not stable, we next gradually move polymers from the inner leaflet  
 24 to the outer leaflet keeping the total number fixed. Finally, for the  
 25 small polymersomes, the stable system contains 550 and 750  
 26 polymers in the inner and outer leaflets respectively, and, in the  
 27 larger polymersome, there are 3700 and 6600 polymers respectively.

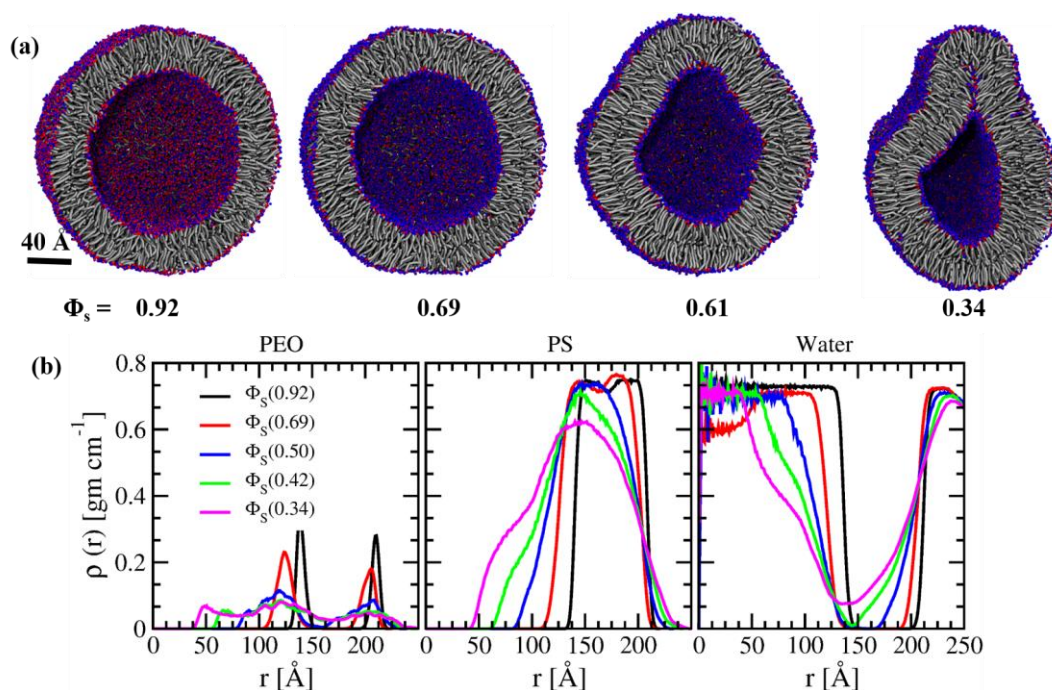
After adjusting the polymer distribution within the polymersome, we  
 next vary the number of water molecules inside the polymersome to  
 best approach an equilibrium structure of the polymersome. With a  
 gradual increase in the number of waters, the polymersome adjusts  
 water density inside by forming multiple pores. After conformational  
 relaxation, the pores again disappear and the polymersome radius  
 adjusts accordingly. With further increase of the number of waters  
 inside the polymersome, the structure starts to disintegrate. Details  
 are shown in **Table 2**. After equilibrating the polymersome structure,  
 we continue the simulations for 100 ns.

**Table 2.** System details for the preparation of initial structure of the larger PEO<sub>3</sub>-PS<sub>15</sub> polymersome.

Trial	Number of polymers		Number of waters inside the polymersome
	Inner leaflet	Outer leaflet	
1	5150	5150	100000
2	4650	5650	100000
3	4150	6150	100000
4	3700	6600	100000
5	3700	6600	110000
6	3700	6600	120000
7	3700	6600	130000

We set up two small polymersomes with polymer chain lengths of PEO<sub>3</sub>-PS<sub>15</sub> and PEO<sub>11</sub>-PS<sub>43</sub>, with diameters of nearly 20 nm and 30 nm





**Fig. 5.** (a) Final configurations of the PEO<sub>3</sub>-PS<sub>15</sub> polymersome for four different  $\Phi_s$  (0.92, 0.69, 0.61, 0.34).  $\Phi_s$  is the fraction of solvent present inside polymersome relative to initial structure. PEO is shown in blue and red and PS in gray. The diameter is approximately 40 nm. When  $\Phi_s$  drops below 0.6, the polymersome bilayer starts to contract non-spherically. (b) Density profiles of PEO, PS and water from the center of mass of the polymersome.

1 respectively, as shown in SI-1. Each system contains 1300 polymers  
 2 and 400000 water molecules. Finally, a large polymersome with  
 3 diameter of around 40 nm is simulated for 110 ns (Figure 5). This  
 4 system contains 10,300 PEO<sub>3</sub>-PS<sub>15</sub> polymers and 1,090,000 water  
 5 molecules. Altogether it has 1,759,500 CG beads. Six trials have been  
 6 performed for each polymersome with varying water number  
 7 water molecules inside to obtain the optimized for diameter for the  
 8 equilibrium spherical structure. We also test the response of the  
 9 two smaller polymersomes as we shrink the inner compartment  
 10 gradually removing water. Results for the small polymersomes are  
 11 also discussed in SI-1 to SI-3.

### 13 Polymersome Shape Change

14 Next, we computationally mimic the contraction of the inner volume  
 15 due to the diffusion of solvent from inside to outside of the  
 16 polymersome, as in experiments<sup>11, 23</sup>. The computational process  
 17 does not correspond to a spontaneous diffusion process. We are  
 18 artificially accelerating the diffusion of solvent through the  
 19 membrane. The diffusion of a hydrophobic compound should take  
 20 place at timescales of seconds to hours, which would allow more  
 21 time for the vesicle to relax in experiments. We take the final  
 22 structure of the large 40 nm diameter polymersome after 100 ns  
 23 simulation time, then randomly select a range of CG solvent beads  
 24 from 2000 to 10000, from the inner hydrophilic core, place those  
 25 solvent beads at least 20 Å away from the outer radius of the  
 26 polymersome and equilibrate for another 30-50 ns until the inner  
 27 leaflet is equilibrated, and next repeat the cycle. We also test this  
 28 algorithm for the presence of both CG water and a model CG  
 29 hydrophobic solvent bead, with parameters characterized by the  
 30 interfacial bead of the PEO-PS polymer. Twenty cycles (Cycle 1 to

Cycle 20) are performed, for each case. To remove the overlap during  
 the insertion of water at outside the polymersome, we first select a  
 water molecule which is at least 20 Å away from the polymersome  
 and then add a small displacement to its original position. The new  
 position is the updated position of the water molecule that was  
 originally inside the polymersome. Additionally, before gradually  
 increase the time step from 0.01 fs to 10 fs, the system is minimized  
 for 10000 steps. The final snapshots after different cycles for the  
 contraction of the polymersome in CG water are shown in Figure 5(a)  
 and SI-4. Final configurations in presence of 20 % hydrophobic  
 solvent are also incorporated in SI-5. The driving force of the  
 polymersome shape change under osmotic pressure stimuli is the  
 reduction in volume of its inner compartment<sup>25, 26</sup>. The density  
 profiles of both polymers and water molecules from the center of the  
 polymer assemblies, as shown in Figure 5 (b), SI-6, and SI-7,  
 characterize the degree of contraction. The contraction of the inner  
 compartment is also evident from the variation of inner core radius  
 (see SI-8). Upon contraction of the vesicle, the density and shape of  
 the PEO and PS significantly shift. Initially when the solvent fraction  
 ( $\Phi_s$ ) is above 0.6 (up to Cycle 6), under the low stress conditions, it  
 contracts symmetrically with an overall spherical structure.  $\Phi_s$  is the  
 fraction of solvent present inside the polymersome with respect to  
 its equilibrium structure. Transferring more water from inside of the  
 polymersome to outside, contracts the inner core further and the  
 bilayer also starts to bend inward, after which eventually shape of  
 the polymersome becomes non-spherical. The change in spherical  
 symmetry can also be characterized by the variation of the ratio  
 between minimum ( $I_{min}$ ) and maximum ( $I_{max}$ ) principle axis of the

1 moment of inertia,  $I$ , of the polymersome (**Figure 6(a)**). Here,  $I = \sum_i m_i r_i^2$ . Up to Cycle 3, the ratio is almost 1 referring to a spherical geometry. Afterward, the value starts to decrease substantially. In comparison, in the case the solvent is mixed CG water and a model hydrophobic bead, we find that the ratio decreases more quickly, indicating the formation of a non-spherical geometry at earlier cycles.

Next, to understand the coupling between the two leaflets of the polymersome during shape transformation, we compute the gyration order parameter ( $G_r$ ).  $G_r$  is defined as,

$$G_r = 1 - \frac{\langle r_{g_l}(i) \rangle}{\langle r_{g_l}(0) \rangle}$$

Here  $r_{g_l}(0)$  and  $r_{g_l}(i)$  are the radius of gyration of the individual leaflets, outer or inner, of the polymersome without and under the osmotic pressure stress conditions respectively.  $G_r$  vary from 0 to 1. 0 means no contraction of the polymersome respect to its equilibrium conformation, whereas for fully contracted structures it is 1. Contraction of the individual leaflets of the polymer vesicles is evident from **Figure 6(b)**. It can be further seen that magnitude of the contraction of the two leaflets are significantly different from each other (**also see SI 9**). Before reaching a plateau region after  $\Phi_s=0.6$ , the degree of contraction of the inner leaflet is relatively higher than the outer leaflet. Such anisotropic contraction is only possible as the hydrophobic core begins to expand.

In comparison, in the case that the solvent is mixed CG water and a model hydrophobic bead, we find that the inner leaflet contracts to a greater degree in earlier cycles. **Figure 6(c)** shows the average hydrophobic core width after each cycle. As in the membrane case, the density fraction of the hydrophobic core,  $\rho_f$  is defined as  $\frac{\rho_{PS}}{\rho_{PS} + \rho_{PEO}}$ . Any regions with  $\rho_f$  greater than 0.8 are considered a part of the hydrophobic core width. The hydrophobic core width increase is only possible since the radius of gyration of the inner core

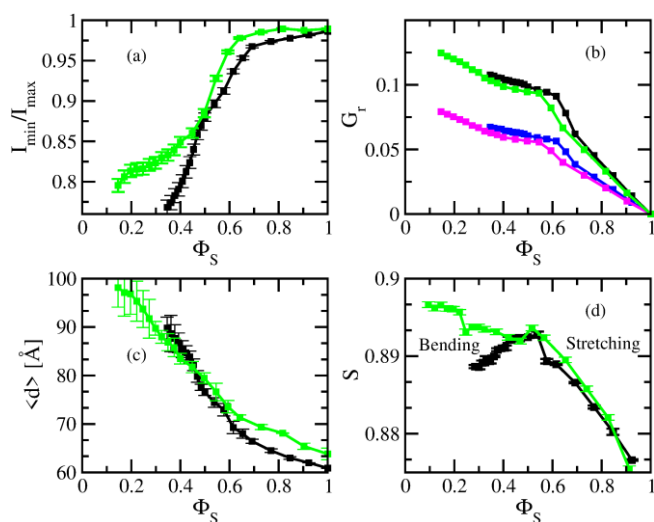
decreases more quickly than the radius of gyration of the outer core. Indeed, an increase in vesicle thickness of the PEO-PS polymersome under osmotic pressure stress is also found experimentally<sup>24</sup>. The equilibrium polymersome vesicle shape balances the membrane bending energy with the line tension of the membrane edge<sup>63, 64</sup>. Diffusion of solvent forces the inner compartment of the polymersome to contract. Shrinking decreases the surface area of the polymersome but increases its bending energy. In comparison, in the case that the solvent is mixed CG water and a model hydrophobic bead, we find that the hydrophobic core is thicker, and the increase in thickness continues as cycles continue. By expanding the hydrophobic counterpart, di-block copolymer vesicles minimize the degree of shrinking of the outer leaflet under the osmotic pressure stress to avoid any additional energy cost due to bending.

This increase in core radius can be achieved via stretching of individual polymers. Average stretching  $S$  of the PS counterpart of the PEO-PS polymers is shown in **Figure 6(d)**.  $S$  is defined as<sup>65</sup>

$$S = \frac{x}{L}$$

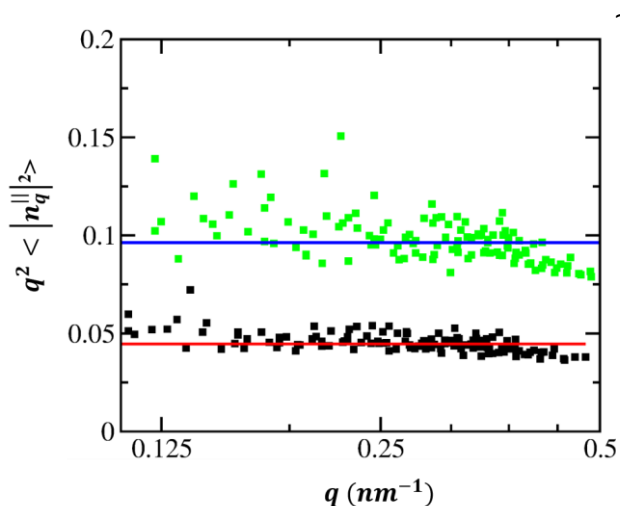
Here,  $x$  and  $L$  are the end-to-end distance and contour length of the PS chain respectively. Stretching of the PS chain due to reduced volumes of the polymersome is clearly evident in the beginning of the perturbation to the spherical structure. Importantly,  $S$  reaches a maximum at  $\Phi_s=0.6$  and afterwards remains constant or decreases very gradually. It correlates nicely with the shape change of the polymersome. Up to  $\Phi_s=0.6$  (Cycle 7), due to the stretching of the PS chain, the polymersome contracts symmetrically and maintains a spherical geometry. After the PS chain reaches its maximum stretching limit, after Cycle 7, the polymersome shape is governed by membrane bending and generates non-spherical shapes. Depending on the reduced volume, the presence of two distinct regimes of the polymer membrane response (stretching and bending) is quite clear from all of the four parameters, as shown **Figure 6**. Hence, in the beginning under low stress conditions, the polymers start to stretch to keep the equilibrium spherical shape of the polymersome via stretching of individual polymers. After a certain threshold limit stretching of the polymers reaches a maximum, bending takes over and the polymersome becomes non-spherical. In comparison, in the case that the solvent is mixed CG water and a model hydrophobic bead, we find that the PS chains stretch to a greater degree in earlier cycles. In addition, the transition to the bending regime occurs at earlier cycles.

#### Bending Modulus of PEO-PS Bilayer



**Fig. 6.** Variation of average (a) ratio between minimum ( $I_{min}$ ) and maximum ( $I_{max}$ ) principle axis (b) gyration order parameter ( $G_r$ ) (c) width of the hydrophobic core and (d) stretching  $S$  of PS counterpart of the PEO-PS polymers as a function of  $\Phi_s$ .  $\Phi_s$  is the fraction of solvent present inside the polymersome with respect to its equilibrium structure. The contraction in the presence of only CG water is black, while the contraction in the presence of both CG water and model hydrophobic CG solvent is indicated in green. In (b) the black and blue line correspond to  $G_r$  for inner and outer leaflets respectively, while the green and pink line correspond to the  $G_r$  for the inner and outer leaflets in the presence of both CG water and CG solvent. Two different regimes, stretching and bending, due to the contraction of the inner compartment of the polymersome emerge.





**Fig. 7.** The spectrum of longitudinal polymer orientation fluctuations  $\langle |n_{||q}^||^2 \rangle$  of the PEO-PS bilayer multiplied by  $q^2$ . The spectrum in the presence of only CG water is black, while the spectrum in the presence of both CG water and model hydrophobic CG solvent is indicated in green.

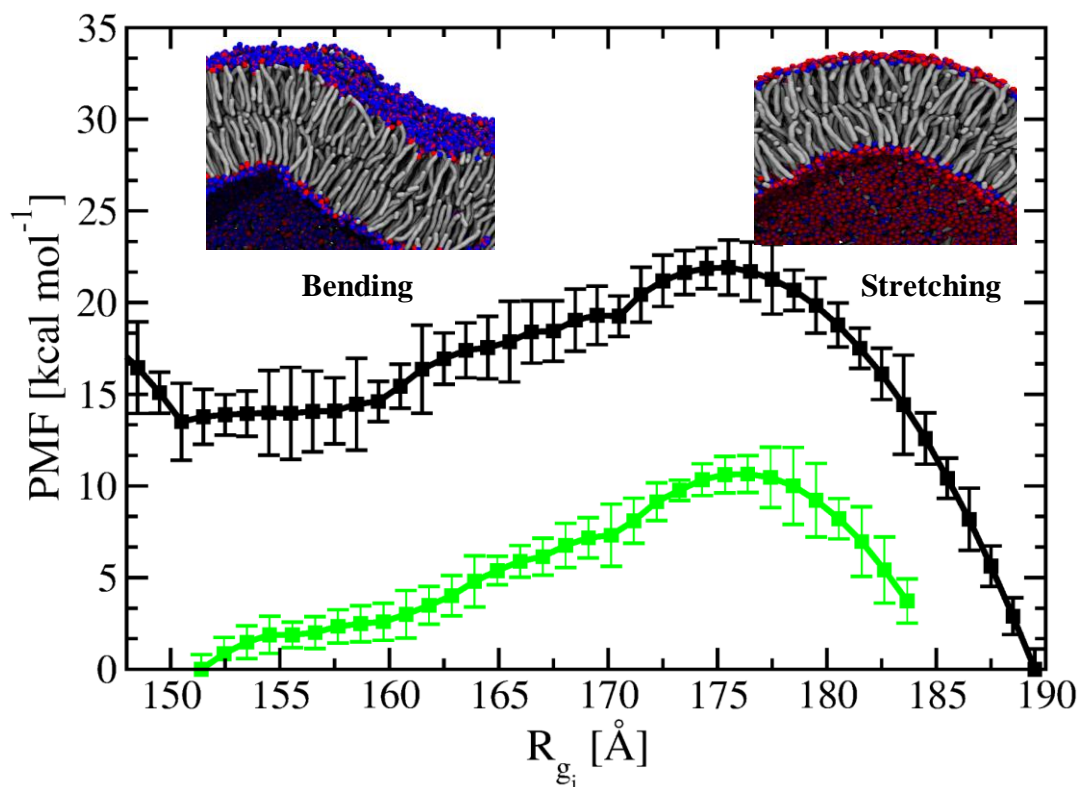
1 Considering the relevance of the membrane bending for the shape  
 2 transformation of the polymersome under osmotic pressure stimuli,  
 3 we calculate bending modulus ( $\kappa$ ) of the PEO-PS membrane based on  
 4 the fluctuation spectrum of the polymer orientation. This method  
 5 has previously been developed and applied to phospholipid  
 6 membranes<sup>66, 67</sup>, but here we apply the method to polymer  
 7 membranes. In short,  $\kappa$  is related to the fluctuations of polymer  
 8 orientation<sup>67, 68</sup>:

$$\langle |n_{||q}^||^2 \rangle = \frac{K_B T}{q^2 \kappa}$$

9 Here  $n_{||}$  is the longitudinal component of the spectrum of the  
 10 polymer orientation. The polymer orientation is defined by a vector  
 11 connecting the two ends of the polymer hydrocarbon chain (PS  
 12 chain). An additional PEO<sub>3</sub>-PS<sub>15</sub> membrane with 2000 polymers is  
 13 simulated for 110 ns in aqueous solution to obtain  $\kappa$ . **Figure 7** shows  
 14 the variation of  $n_{||}$  as a function of  $q$ .  $\kappa$  is around  $22 k_B T$ . This  
 15 measurement of  $\kappa$  is similar to what is expected for lipid  
 16 membranes<sup>5</sup>, but slightly lower than might be expected for polymer  
 17 membranes. To put this measurement in perspective, the bending  
 18 rigidity for diblock copolymer membranes have been experimentally  
 19 reported to range from approximately  $20 k_B T$  up to  $500 k_B T$ ,  
 20 dependent on the specific copolymer chemistry and the molecular  
 21 weight<sup>5, 14</sup>. In comparison, in the case that the solvent is mixed CG  
 22 water and a model hydrophobic bead (20 %), we find that the  
 23 bending modulus decreases by approximately 50% to  $10 k_B T$ . The  
 24 decrease in bending modulus may be related with the decrease in  
 25 area elastic modulus of the membrane due to the presence of the  
 26 model hydrophobic solvent. Indeed, previously Bermudez et al.<sup>5</sup>  
 27 found that  $K_B = \beta K_A d^2$  where  $\beta$  is a constant and  $d$  is the width of  
 28 the membrane. To check this, we also measure  $K_A$  of the PEO<sub>3</sub>PS<sub>15</sub>  
 29 membrane in the presence of 20% model hydrophobic solvent. To be  
 30 consistent with the  $K_B$  calculation, we calculate  $K_A$  of the larger  
 31 PEO<sub>3</sub>PS<sub>15</sub> membrane with 2000 polymers following the same  
 32 methodology as previously discussed. The variation of  $\gamma$  as a function  
 33 of surface area of the membrane is shown in SI-10 and the estimated  
 34 value of  $K_A$  from the slope is around  $86.2 \text{ dyne cm}^{-1}$ . Hence,  
 35 consistent with  $K_B$ , the  $K_A$  value also decreases around 33 % in  
 36 the presence of model hydrophobic solvent.

### Free Energy Profile of Polymersome Shape Change

Next, we compute the free energy cost of the polymersome going  
 transitioning from the stretching regime to the bending regime. The  
 Potential of Mean Force (PMF) is constructed using US techniques  
 while considering the radius of gyration of the inner leaflet ( $r_{g_i}$ ) as a  
 reaction co-ordinate. Details can be found in the Supporting  
 Information. As the shape change is happening due to contraction of  
 inner core of the polymersome, the radius of gyration of the inner  
 leaflet is an immediate choice for the reaction coordinate.  
 Besides  $r_{g_i}$ , the surface area of the inner compartment of the  
 polymersome, local curvature of the bilayer,  $\frac{I_{min}}{I_{max}}$  ratio, etc. can also  
 be used as reaction co-ordinates. In general, in US simulations, an  
 external potential is applied to move the system out of the  
 equilibrium. But here, for each window, the starting configuration  
 (initial structure of a particular cycle) is very far from the lowest  
 energy structure for that particular window. As the harmonic  
 potential ( $H$ ) is applied with respect to the starting configuration, the  
 system moves gradually back to its local minimum with sufficient  
 sampling of the in-between regions. Two distinct regimes, stretching  
 and bending, are observed from **Figure 8**. It is further found that  
 these two regimes are separated by a high energy barrier of around  
 $\sim 20 \text{ kcal mol}^{-1}$ . This high energy barrier is consistent with the high  
 bending modulus of the PEO-PS membrane. It is also important to  
 note that, as we are not considering the effect of the hydrophobic



**Fig. 8.** Potential of mean force (PMF) for the shape change of the polymersome. Here  $R_{g_i}$  is the radius of gyration of the inner leaflet. Stretching and bending of the polymersome bilayer due to contraction of inner compartment are clearly evident. These two regimes are separated by a high energy barrier around  $\sim 20$  kcal mol $^{-1}$ . PMF in the presence of only CG water is black, while the PMF in the presence of both CG water and model hydrophobic CG solvent is indicated in green.

1 solvent, this is the energy cost only due to structural rearrangement  
 2 of the polymers during shape transformation of the polymersome  
 3 under osmotic pressure stimuli. In experiments<sup>11</sup>, a mixture of water  
 4 and hydrophobic solvent is used. The presence of hydrophobic  
 5 solvent speeds up the shape change due to the increased dynamics  
 6 of the PS chains as demonstrated by the self-intermediate scattering  
 7 function as shown in SI-11.<sup>38</sup> and reduces the bending modulus of the  
 8 PEO-PS membrane as discussed previously. In comparison, in the  
 9 case that the solvent is mixed CG water and a model hydrophobic  
 10 bead, we find a barrier that decreases by 50% to  $\sim 10$  kcal mol $^{-1}$ . This  
 11 is qualitatively consistent with the threshold pressure for instability  
 12 predicted by Ou-Yang and Helfrich<sup>13</sup>, and thus the free energy  
 13 barrier, that is predicted to be proportional to the bending rigidity

## 15 CONCLUSIONS

16 Currently, the molecular picture of how individual polymer chains  
 17 guide the shape transformation of polymersomes is mostly missing.  
 18 Herein, we perform a systematic analysis of the shape  
 19 transformation of PEO-PS diblock polymersomes due to reduced  
 20 volumes and reduced areas of its inner compartment. The presence  
 21 of two distinct regimes, stretching and bending, of the polymersome  
 22 membrane are evident. The initial response of the membrane, the  
 23 stretching individual polymer chains is consistent with macroscopic  
 24 experimental observations—an increase in membrane thickness due  
 25 to stretching of the PEO-PS polymersome under osmotic pressure  
 26 stress<sup>24</sup>. Furthermore, these two regimes are separated by a high  
 27 energy barrier of around  $\sim 20$  kcal mol $^{-1}$ . While stretching of  
 28 individual polymer chains maintains the spherical shape of the  
 29 polymersome under initial contractions, the bending is responsible

for its final non-spherical geometry. The presence of hydrophobic  
 solvent lowers the barrier free energy for the shape change most  
 likely due to the decreasing bending modulus of the PEO-PS  
 membrane. In the presence of hydrophobic solvent the area elastic  
 modulus also proportionally decreases. These results can help guide  
 experimentalists in the future design of stimuli-responsive polymer  
 vesicles for various applications. The shape of the polymersome is a  
 key factor that regulates interactions of polymersomes with cells<sup>69</sup>,  
 70. Like red blood cells and disc-like erythrocytes<sup>71-73</sup>, the shape of  
 the polymersome is also believed to affect its flow properties<sup>74</sup>.

## 40 SUPPORTING INFORMATION

The shape change of both a small and large polymersome are  
 discussed in SI-1 to SI-12.

## 43 Conflicts of interest

“There are no conflicts to declare”.

## 45 Acknowledgements

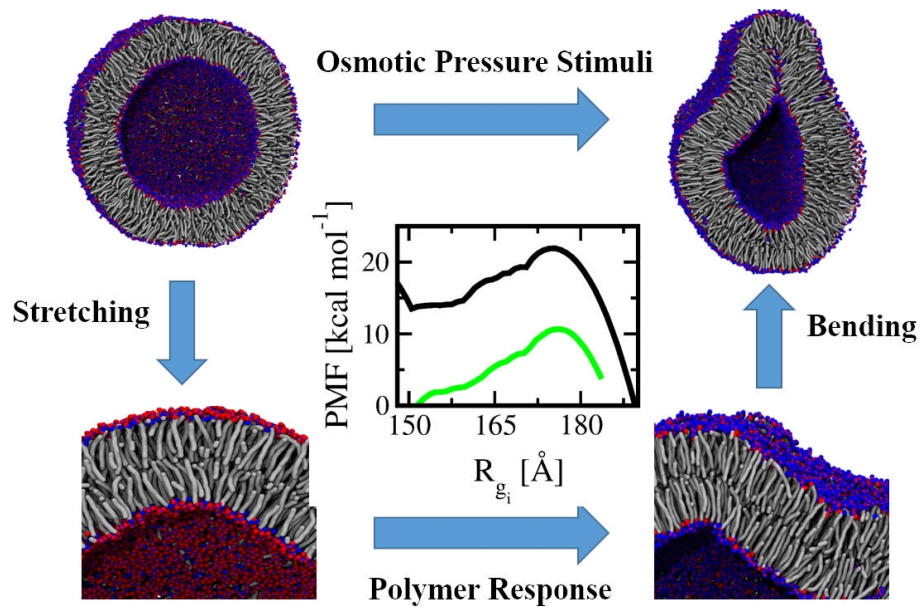
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