



# Polymer Concentration Maximizes Encapsulation Efficiency in Electrohydrodynamic Mixing Nanoprecipitation

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Lee KH, Khan FN, Cosby L, Yang G and Winter JO (2021) Polymer Concentration Maximizes Encapsulation Efficiency in Electrohydrodynamic Mixing Nanoprecipitation. Front. Nanotechnol. 3:719710. doi: 10.3389/fnano.2021.719710 Encapsulation in self-assembled block copolymer (BCP) based nanoparticles (NPs) is a common approach to enhance hydrophobic drug solubility, and nanoprecipitation processes in particular can vield high encapsulation efficiency (EE). However, guiding principles for optimizing polymer, drug, and solvent selection are critically needed to facilitate rapid design of drug nanocarriers. Here, we evaluated the relationship between drug-polymer compatibility and concentration ratios on EE and nanocarrier size. Our studies employed a panel of four drugs with differing molecular structures (i.e., coumarin 6, dexamethasone, vorinostat/SAHA, and lutein) and two BCPs [poly(caprolactone)b-poly(ethylene oxide) (PCL-b-PEO) and poly(styrene)-b-poly(ethylene oxide) (PSb-PEO)] synthesized using three nanoprecipitation processes [i.e., batch sonication, continuous flow flash nanoprecipitation (FNP), and electrohydrodynamic mixingmediated nanoprecipitation (EM-NP)]. Continuous FNP and EM-NP processes demonstrated up to 50% higher EE than batch sonication methods, particularly for aliphatic compounds. Drug-polymer compatibilities were assessed using Hansen solubility parameters, Hansen interaction spheres, and Flory Huggins interaction parameters, but few correlations were EE observed. Although some Hansen solubility (i.e., hydrogen bonding and total) and Flory Huggins interaction parameters were predictive of drug-polymer preferences, no parameter was predictive of EE trends among drugs. Next, the relationship between polymer: drug molar ratio and EE was assessed using coumarin 6 as a model drug. As polymer: drug ratio increased from <1 to 3-6, EE approached a maximum (i.e., ~51% for PCL BCPs vs. ~44% PS BCPs) with Langmuir adsorption behavior. Langmuir behavior likely reflects a formation mechanism in which drug aggregate growth is controlled by BCP adsorption. These data suggest polymer:drug ratio is a better predictor of EE than solubility parameters and should serve as a first point of optimization.

Keywords: electrohydrodynamic mixing, nanoprecipitation, Hansen solubility parameters, block copolymer, drug encapsulation, micromixer

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# INTRODUCTION

Hydrophobic drugs are poorly soluble in biological media; hence, drug delivery carriers are often employed to improve their biodistribution profiles (Torchilin, 2007; Kumar et al., 2020). Amphiphilic block copolymer (BCP) micelles and self-assembled nanoparticles (NPs) consisting of a hydrophobic core and a hydropholic corona are the most commonly employed hydrophobic drug carriers (Bobo et al., 2016) because of their high drug loading capacity, tunable properties, and potential for controlled and/or stimuli-responsive release (Mura et al., 2013). However, these self-assembled nanostructures have largely failed to be translated to the clinic (Anselmo and Mitragotri, 2016). The majority of pre-clinical micelles are composed of low molecular weight polymers that demonstrate poor stability in blood (Zhang et al., 2013). Their low entropic barrier to chain rearrangement can result in dissolution. Larger (> 10 kDa) BCP micelles are more stable (Johnson and Prud'homme, 2003a; Zhang and Eisenberg, 1999); however, large BCPs are more difficult to process because of their reduced aqueous solubility. Particularly, it can be challenging to identify the optimal drug, BCP, and solvent combinations and operating conditions to maximize encapsulation efficiency (EE) (Martínez Rivas et al., 2017).

Processes based on nanoprecipitation (Figure 1) have shown particular promise for synthesis of nanocarriers with high EE (Martínez Rivas et al., 2017). In nanoprecipitation approaches, hydrophobic drugs, and BCPs in organic solvent are mixed with a miscible aqueous phase. Because the two phases are miscible, the solution rapidly achieves supersaturation, resulting in the formation of nanoparticle aggregates containing drug and BCPs (Figure 1D). Batch nanoprecipitation methods typically employ sonication for mixing (Figure 1B), whereas continuous and/or semicontinuous manufacturing platforms, such as flash



FIGURE 1 | (A) Schematic of electrohydrodynamic mixing-mediated nanoprecipitation (EM-NP) process for synthesizing polymer nanocarriers. In EM-NP, electrohydrodynamic (EHD) flow of the continuous aqueous phase is generated by applying a voltage across an electrified needle and grounding electrode. EHD flow disperse the organic phase, containing block copolymers (BCPs) and encapsulants, which is simultaneously injected through the electrified needle. As miscible organic and aqueous solvents are employed, BCPs and encapsulants achieve instantaneous high supersaturation resulting in encapsulant aggregation and subsequent BCP adsorption. (B) Schematic of sonication nanoprecipitation process. The aqueous phase was sonicated with a constant duty cycle while the organic phase was added. (C) Jet mixing reactor (JMR) schematic. The JMR was used to compare EM-NP to FNP processes and consisted of a main line (d<sub>main</sub> = 0.04") carrying polymer and drug, and two perpendicular jet lines (d<sub>jet</sub> = 0.02") carrying water. Jet lines intersect with the main line at right angles in the confined JMR volume generating intense mixing. (D) Water miscible organic solvent containing BCPs and encapsulant are dispersed in water. BCPs and encapsulants achieve instantaneous high supersaturation resulting in encapsulant aggregation and subsequent BCP adsorption.



nanoprecipitation (FNP) or electrohydrodynamic mixingmediated nanoprecipitation (EM-NP), achieve mixing using jet mixer reactors (**Figure 1C**) (Saad and Prud'homme, 2016) or electrospray devices (**Figure 1A**) (Lee et al., 2019; Cosby et al., 2020), respectively. In nanoprecipitation processes, operating parameters (i.e., voltage, organic:aqueous ratio) and polymer, drug, and solvent compatibility can contribute to EEs.

Here, we evaluated the effects of two of these contributing factors on EE of nanocarriers produced using nanoprecipitation. First, we explored the influence of polymer, drug, and solvent interactions on EE using Hansen solubility parameters (HSPs), Hansen interaction spheres (Ra), and Flory-Huggins interaction parameters ( $\chi^{sp}$ ) (Turpin et al., 2018). It has been suggested that optimal EE requires high drug compatibility with the hydrophobic BCP block (Sunogrot et al., 2017) or hydrogen bonding potential of that block (Zhang et al., 2009), and is maximized when solution drug concentrations near maximum solubility are employed (Mora-Huertas et al., 2010). However, others have suggested that solubility in both BCP blocks is required (Latere Dwan'Isa et al., 2007) or that none of the parameters can adequately capture EE trends because they account primarily for enthalpic contributions without incorporating entropic corrections (Turpin et al., 2018). Second, we investigated EE as a function of drug: polymer ratio, comparing the influence of this parameter to that of polymer-drug-solvent compatibilities.

As model systems, we investigated BCPs consisting of polyethylene oxide (PEO) as the hydrophilic block and either poly(styrene) (PS) or poly(caprolactone) (PCL) as the hydrophobic block (i.e.,  $PS_{9.5kDa}$ -*b*-PEO<sub>18kDa</sub> and PCL<sub>6kDa</sub>-*b*-PEO<sub>5kDa</sub>). PS was chosen because it has minimal hydrogen bonding potential relative to PCL, important for testing the hypothesis that hydrogen bonding potential drives high EE (Zhang et al., 2009). A series of four drugs with differing molecular structures were employed (**Figure 2**): aromatics coumarin 6 and dexamethasone (DEX), which display steroid-like structures; vorinostat (also known as SAHA), which contains a single ring structure, an aliphatic tail, and a polar terminal group; and lutein, which contains a long aliphatic segment terminated by ring structures on each end. These compounds have different

molecular structures allowing the predictive potential of solubility parameters to be assessed. Additionally these materials have biological use as fluorescent imaging agents [coumarin 6 (Eley et al., 2004; Nabar et al., 2018a)], anti-inflammatory steroids [DEX (Nabar et al., 2018a)], cancer therapeutics [vorinostat/SAHA (Chiao et al., 2013a)], and nutraceuticals [lutein, found in fruits and vegetables (Krinsky and Johnson, 2005; Mitri et al., 2011)]. Nanocarriers were synthesized using three nanoprecipitation methods: batch sonication (**Figure 1B**), FNP in a jet-mixing reactor (JMR) (**Figure 1C**), and primarily EM-NP (**Figure 1A**) to assess EE differences arising from manufacturing method. Collectively, these experiments and models provide important insight into nanocarrier design to maximize EE.

## MATERIALS AND METHODS

## **Materials**

Poly(ε-caprolactone-b-ethylene oxide) (PCL<sub>6kDa</sub>-b-PEO<sub>5kDa</sub>) and poly(styrene-b-ethylene oxide) (PS9.5kDa-b-PEO18.0kDa) amphiphiles with carboxylic acid termination were purchased from Polymer Source (Montreal, Canada). Dexamethasone (DEX) (Cat No. BML-EI126-0001) was purchased from Enzo Life Sciences. Coumarin 6 dye (Cat No. 442631), Suberoylanilide hydroxamic acid (SAHA, also known as Vorinostat, Cat No. SML 0061), Lutein (Xanthophyll, Cat No. X6250), tetrahydrofuran (THF, Cat No. 401757), and dimethyl sulfoxide (DMSO, Cat No. 276855) were purchased from Sigma Aldrich. Hamilton<sup>™</sup> metal hub blunt point needles (27 gauge, 410 µm o.d.; 210 µm i.d.) and glass Luer lock syringes (1 ml) were purchased from Fisher Scientific. Polytetrafluoroethylene heat shrink tubing (30 gauge, 0.006" wall, shrink ratio 2:1) was purchased from Component Supply company (Lakeland, FL). For centrifugal filtration, Amicon Ultra centrifugal filter units (pore size: 100 kDa MWCO, Cat No. UFC910024) were purchased from Fisher Scientific.

## Methods

## **Polymer Nanocarrier Synthesis**

BCP NPs and drug loaded nanocarriers were produced by mixing water-miscible organic solvent containing hydrophobic

encapsulants and BCP with water, thereby inducing nanoprecipitation. Polymer nanocarriers were synthesized using probe sonication, EM-NP, or FNP in a jet mixing reactor (Figure 1). The organic phase consisted of one of the BCPs (PCL-b-PEO at 18.2 nmol and PS-b-PEO at 7.2 nmol) and one hydrophobic encapsulant (0.1 µmol) prepared at fixed BCP to hydrophobic encapsulant molar ratio (ratios of 0.18 and 0.072 for PCL-b-PEO and PS-b-PEO, respectively) in a water-miscible organic solvent (either THF or DMSO). A fixed molar ratio was employed in these experiments to examine the effect of molecular volume on encapsulation efficiency in the context of solvent and polymer compatibility. Low polymer:drug molar ratios were employed to delineate differences in EE observed by distinct BCP types. For solvents, THF was generally preferred as it is more biocompatible (FDA, 1997); however, DMSO was used as a cosolvent with SAHA to increase its solubility.

For PS-*b*-PEO nanocarriers, PS-*b*-PEO (1 mg ml<sup>-1</sup> in THF, 200  $\mu$ L) was mixed with coumarin 6 (5 mg ml<sup>-1</sup> in THF, 7  $\mu$ L), DEX (5 mg ml<sup>-1</sup> in THF, 8  $\mu$ L), Lutein (1 mg ml<sup>-1</sup> in THF, 57  $\mu$ L), or SAHA (5 mg ml<sup>-1</sup> in DMSO, 5  $\mu$ L). The final volume of organic phase was adjusted to 800  $\mu$ L by adding excess organic solvent; for coumarin 6, DEX, and Lutein samples, THF, whereas, for SAHA, THF, and DMSO were added to make the final volume ratio 1:1 of THF to DMSO. For PCL-*b*-PEO nanocarriers, PCL-*b*-PEO (1 mg ml<sup>-1</sup> in THF, 200  $\mu$ L) was mixed with the same amount of hydrophobic encapsulant and excess organic solvent as used for PS-*b*-PEO nanocarriers. The aqueous phase for each sample was 10 ml of ultrapure water (Milli-Q).

Selected EM-NP experiments examined the effect of increasing BCP to drug molar ratio on EE to explore the importance of drug aggregate nucleation rate relative to BCP aggregation rate. Aggregation rates are concentration dependent, thus aggregation should occur more rapidly at higher concentration. Coumarin 6 was selected as the model drug because of its fluorescent properties that enable easy discernment of particle aggregation under UV light. In these experiments, the organic THF solution contained a fixed amount of Coumarin 6 (0.1 µmol) and with increasing BCP amounts (PCL-b-PEO, 4.5 nmol-0.73 µmol and PS-b-PEO, 1.8 nmol-0.29 µmol). PCL-b-PEO or PS-b-PEO (20 mg/ml in THF, 2.5–400  $\mu$ L) was mixed with coumarin 6 (5 mg ml<sup>-1</sup> in THF, 7 µL). The final volume of organic phase was adjusted to 800 µL by adding excess THF.

For EM-NP synthesis, the organic phase was loaded into a glass syringe (1 ml capacity) connected to a PTFE insulated stainless steel needle. A grounding wire, insulated 1 cm to the tip, was also prepared. The needle and the grounding wire were submerged inside ultrapure water (Milli-Q, 10 ml) contained in a glass vial. A high voltage supply was used to apply a high voltage (-2500 V) across the needle and grounding wire as the organic phase was pumped into the aqueous phase using a syringe pump (flow rate: 12.7 ml h<sup>-1</sup>). Half of the organic phase (400 µL) was sprayed in each experiment.

Batch nanoprecipitation using probe sonication for mixing was employed as a control (**Figure 1B**). In the probe sonication method, half of the organic phase ( $400 \mu$ L) was pipetted into ultrapure water

(Milli-Q, 10 ml) contained in a glass vial while the aqueous phase was sonicated using a probe sonicator (Branson Sonifier 450) at a constant duty cycle. Sonication was continued for 5 min after addition of the organic phase. For additional comparison, BCP nanocarriers were also synthesized using FNP in a jet mixing reactor (JMR) (Ranadive et al., 2019). The JMR is a crossflow micromixer (Figure 1C) in which two fluid jet lines impinge on a single main fluid line at right angles. The EM-NP system operates in semi-batch, whereas the JMR is a continuous flow system. Thus, to approximate EM-NP conditions, the flow rates of organic and aqueous fluid streams were chosen to match the final organic to aqueous ratio achieved through EM-NP. EM-NP and JMR experiments were both performed at specific polymer:drug molar ratios (i.e., 1.45 for PS-b-PEO and 3.64 for PCL-b-PEO), selected to maximize EE. Briefly, PCL-b-PEO or PS-b-PEO (20 mg ml<sup>-1</sup> in THF, 200 µL) were mixed with coumarin 6 (5 mg ml<sup>-1</sup> in THF, 7  $\mu$ L) model encapsulants. The final volume of organic phase was adjusted to 800 µL by adding excess organic solvent. The organic solution was then added through the main flow line of the JMR at 0.4 ml min<sup>-1</sup>, whereas ultrapure water (Milli-Q) was injected through the jet lines at  $10 \text{ ml min}^{-1}$ . Coumarin 6 loaded nanocarriers were collected from the product line. All samples were purified via centrifugal filtration (molecular weight cutoff: 100 kDa) to remove organic solvent and unencapsulated drugs prior to evaluation.

# Characterization of Nanocarrier Size and Polydispersity

Particle sizing can be determined using a variety of techniques, such as dynamic light scattering (DLS), electron microscopy (EM), or nanoparticle tracking analysis (NTA). Although DLS or NTA can yield critical information on particle size, they does not permit evaluation of particle morphological changes that might be anticipated as particles shift from spherical to worm-like morphologies (Duong et al., 2014). Thus, nanocarrier size and polydispersity were characterized using transmission electron microscopy (TEM). It is important to note that TEM will show smaller particle sizes than DLS as a result of differences in hydration.

Before depositing a sample on a TEM grid, a PELCO easiGlow Glow Discharge Cleaning System was used to make the grid surface more hydrophilic. Then,  $12.5 \,\mu$ L of the sample was pipetted onto a silicon pad. TEM grid was inverted over the sample droplet for 5 min. Excess sample was then wicked away using filter paper. The deposited sample was negatively stained using 1% uranyl acetate. TEM images were collected using an FEI Tecnai G2 Bio Twin TEM (80 kV).

Particle size and distribution were determined using ImageJ software using the "Analyze Particles" feature (Abramoff et al., 2004). The Feret length ( $L_F$ ), or the longest distance between two points of a particle circumference, was used to represent NP diameter. Size analysis was performed for each sample in triplicate and pooled. Particle size histograms were plotted as the normalized frequency as a function of  $L_F$  (bin size: 5 nm). Particle size distributions (PSD) were fit to log-normal distributions using SigmaPlot (Systat Software Inc., San Jose, CA, United States). Briefly, data were fit to the following

equations to extract the particle distribution parameters, mode, mean, standard deviation, and effective polydispersity (PD<sub>eff</sub>):

Lognormal Distribution : 
$$y(x) = \frac{A}{x} e^{\left[-0.5\left(\frac{\ln(\frac{x}{\lambda_0})}{b}\right)^2\right]}$$
 (1)

$$A = \frac{1}{\sqrt{2\pi b}} \tag{2}$$

where  $\mathbf{x}_0$  and  $\mathbf{b}$  are the median and the shape parameter, respectively.

Number Mean : 
$$(x) = e^{((ln (x_0) + (\frac{b^2}{2})))}$$
 (3)

Mode:

$$mode = e^{\left((\ln (x_0) - b^2)\right)} \tag{4}$$

Geometric standard deviation :  $\sigma = e^b$ 

Lower (-dev) and upper (+dev) deviations containing 68% of the particles:

$$(-dev) = \langle x \rangle \left( 1 - \frac{1}{\sigma} \right) \tag{5}$$

$$(+dev) = \langle x \rangle (\sigma - 1) \tag{6}$$

Polydispersity is often defined as the standard deviation/mean. Given the lognormal behavior of these particles, we employed the effective polydispersity (PD<sub>eff</sub>):

$$PD_{eff} = \frac{\sqrt{(-dev)(+dev)}}{\langle x \rangle}$$
(7)

A detailed description of lognormal fits can be found in our previous work (Lee et al., 2019).

#### Encapsulation Efficiency

The encapsulation efficiency of each drug in PS-b-PEO and PCL-b-PEO NPs was evaluated using UV-Vis spectroscopy. Before using UV-Vis spectroscopy and within 5 min of initial synthesis, BCP nanocarriers were purified via centrifugal filtration (molecular weight cutoff: 100 kDa, centrifugation speed, and duration: 4,000 rpm and 15 min, respectively) to remove excess THF and un-encapsulated drug. After the initial filtration step, additional filtration washing was performed with 3 ml of distilled water, repeated 2 times. After purification, ~100 µL of concentrated product remained. An additional 1,000 µL of distilled water was added to recover the product, which was then retrieved and placed in a glass vial (4 ml capacity). Purified products were dried overnight in a vacuum chamber. Dried products in glass vials were resuspended in 1 ml of organic solvent, chosen to dissolve nanocarriers and release encapsulated drug. Prior to use, standard curves for drug in organic solvent were generated for each compound. Solvents were also chosen so as to not interfere with the drug compound spectral peak. Specifically, THF was used for coumarin 6 and lutein, whereas chloroform was used for DEX. A solution of THF and DMSO (1:1 v/v) was used for SAHA. The wavelengths used to quantify coumarin 6, DEX, lutein, and SAHA were 443, 250, 450, and 242 nm, respectively. Encapsulation efficiency (%) was calculated as follows:

 $\label{eq:table_$ 

| Compound   | $\Delta \delta_{D}$ |      |                 | $\Delta \delta_{P}$ |      |      |       |       |
|------------|---------------------|------|-----------------|---------------------|------|------|-------|-------|
|            | PS                  | PCL  | PEO             | Water               | PS   | PCL  | PEO   | Water |
| Coumarin 6 | -1.8                | -0.2 | -1.7            | 0.6                 | 4.2  | -2.8 | -5.8  | -10.7 |
| DEX        | 2.0                 | 3.6  | 2.1             | 4.4                 | 4.1  | -2.9 | -5.9  | -10.8 |
| Lutein     | -2.2                | -0.6 | -2.1            | 0.2                 | 0.1  | -6.9 | -9.9  | -14.8 |
| SAHA       | 1.0                 | 2.6  | 1.1             | 3.4                 | 4.5  | -2.5 | -5.5  | -10.4 |
| PCL        | _                   | _    | _               | 0.8                 | _    | _    | _     | -7.9  |
| PS         | _                   | _    | _               | 2.4                 | _    | _    | _     | -14.9 |
| PEO        | -                   | -    | -               | 2.3                 | _    | -    | -     | -4.9  |
|            |                     | L    | Δδ <sub>H</sub> |                     |      | Δδ   | Total |       |
| Coumarin 6 | 9.6                 | 2.8  | 0.5             | -32.7               | 1.5  | 0.0  | -3.4  | -28.3 |
| DEX        | 15.4                | 8.6  | 6.3             | -26.9               | 7.8  | 6.3  | 2.8   | -22.1 |
| Lutein     | 8.4                 | 1.6  | -0.7            | -33.9               | -0.1 | -1.6 | -5.0  | -30.0 |
| SAHA       | 11.7                | 4.9  | 2.6             | -30.6               | 5.0  | 3.5  | 0.1   | -24.9 |
| PCL        | _                   | _    | _               | -35.5               | _    | _    | _     | -28.4 |
| PS         | _                   | _    | _               | -42.3               | _    | _    | _     | -29.9 |
| PEO        | _                   | -    | -               | -33.2               | _    | _    | _     | -24.9 |

 $\Delta \delta_{D_r} \Delta \delta_{P_r}$  and  $\Delta \delta_{H}$  represent the difference in solubility contributions from dispersion, polar, and hydrogen bonding forces of drug to BCP, segment or water. Smaller differences reflect greater compatibility.

Encapsulation Efficiency (EE) = 
$$\frac{\text{Drug}_{\text{encapsulated}}(\text{mg})}{\text{Drug}_{added}(\text{mg})} \times 100$$
(8)

#### Solubility Parameters Calculations

Hansen solubility parameters (HSPs) representing the contributions from dispersion ( $\delta_D$ ), polar ( $\delta_P$ ), and hydrogen bonding ( $\delta_H$ ) forces, are widely used to access polymer and drug compatibility (Turpin et al., 2018). HSPs were calculated using the group contribution method of Van Krevelen and Te Nijenhuis (Hansen, 2007; Van Krevelen and Te Nijenhuis, 2009). The total solubility parameter value, was then calculated using the equation (Hansen, 2004) (Supplementary Table S1):

$$\delta_{tot}^2 = \delta_D^2 + \delta_P^2 + \delta_H^2 \tag{9}$$

Molecules that have closer values of each individual and total parameter should display greater compatibility. HSP differences (**Table 1**) were calculated by subtracting values for each individual parameter and total (**Supplementary Table S1**).

Hansen solubility parameters (HSPs) for BCP blocks PS, PCL, and PEO, drug encapsulants coumarin 6, DEX, lutein, and SAHA, and THF and DMSO solvents were estimated using the group contribution method of Van Krevelen and Te Nijenhuis. HSPs for water were adopted from the literature (Hansen, 2007). Hansen interaction spheres, given as *Ra* values, map the distance between HSPs for two molecules in three-dimensional space (**Table 2**). *Ra* values were calculated according to (Latere Dwan'Isa et al., 2007):

$$Ra = \sqrt{\left(4\left[\left(\delta_{D1} - \delta_{D2}\right)\right]^{2}\right) + \left[\left(\delta_{P1} - \delta_{P2}\right)\right]^{2} + \left[\left(\delta_{H1} - \delta_{H2}\right)\right]^{2}}$$
(10)

Flory Huggins interaction parameters ( $\chi_{sp}$ ) improve on this by adding a term for molecular volume, which is absent from HSP

**TABLE 2** | Hansen solubility parameter distance (*Ra*) between drug compounds and hydrophobic BCP blocks and water. Lower values indicate greater compatibility.

| Compound   | Ra   |      |      |       |  |  |
|------------|------|------|------|-------|--|--|
|            | PS   | PCL  | PEO  | Water |  |  |
| Coumarin 6 | 11.1 | 4.0  | 6.7  | 34.4  |  |  |
| DEX        | 23.4 | 20.8 | 9.6  | 32.9  |  |  |
| Lutein     | 9.5  | 7.2  | 10.8 | 37.0  |  |  |
| SAHA       | 12.7 | 7.5  | 6.5  | 33.0  |  |  |
| PCL        | _    | _    | _    | 36.4  |  |  |
| PS         | _    | _    | _    | 45.1  |  |  |
| PEO        | _    | _    | _    | 33.8  |  |  |

**TABLE 3** | Flory–Huggins interaction parameter ( $\chi_{sp}$ ) of drugs-polymer and drugwater.

| Compound   | Molar volume (cm <sup>3</sup> /mol) | $\chi_{ m sp}$ |      |      |       |
|------------|-------------------------------------|----------------|------|------|-------|
|            |                                     | PS             | PCL  | PEO  | Water |
| Coumarin 6 | 269.5                               | 13.4           | 1.7  | 4.9  | 128.7 |
| DEX        | 268.8                               | 29.2           | 14.6 | 10.0 | 99.6  |
| Lutein     | 568.9                               | 20.6           | 11.8 | 26.6 | 314.3 |
| SAHA       | 220.3                               | 14.3           | 5.1  | 3.7  | 96.8  |

theory [**Table 3** (Lübtow et al., 2019)]. Flory Huggins parameters were calculated according to:

$$\chi_{sp} = \frac{Ra^2 v_S}{RT} \tag{11}$$

where  $v_s$  is the molar volume of the drug, R is the gas constant, and T is the temperature in Kelvin.

#### Statistical Analysis

Statistical analysis was performed using JMP Pro 14 (SAS Institute, Cary, NC, United States) and SigmaPlot (Systat Software Inc., San Jose, CA, United States). The student's t-test was used to examine statistical differences between EE achieved for a single drug in PCL-*b*-PEO vs. PS-*b*-PEO. Analysis of variance (ANOVA) and Tukey Honestly Significant Difference (HSD) test were used to compare coumarin 6 EE achieved using PCL-*b*-PEO or PS-*b*-PEO NPs synthesized using EM-NP or JMR. The level of significance ( $\alpha$ ) was 0.05 for all tests with *p*-value < 0.05 indicating statistical significance.

## **RESULTS AND DISCUSSION**

## Size Distribution of BCP Nanocarriers Synthesized Using EM-NP Versus Batch Sonication

In these experiments, we investigated the size distribution of empty micelles and BCP nanocarriers synthesized *via* EM-NP versus batch sonication. Scalable nanoprecipitation processes have been shown to yield smaller, more monodisperse nanoparticles than their batch counterparts (Lim et al., 2014)<sup>1</sup>. We also studied the effect of drug encapsulation on resultant nanocarrier sizes. A fixed molar ratio of drug to mass of polymer was employed, yielding polymer:drug molar ratios of 0.18 and 0.072 for PCL-b-PEO and PS-b-PEO, respectively. These low ratios were employed as they represent high drug concentrations relative to polymer, useful to elucidate EE differences between drug molecular structures. To reduce variation resulting from solvent effects, THF was primarily employed with the exception of SAHA, which is only sparingly soluble in THF. For SAHA experiments, a THF/DMSO co-solvent system was employed, which also permitted preliminary investigation of the role of solvent selection in size and EE. For comparing processes, the same organic phases were employed, but mixing was provided by EHD flow or probe sonication for EM-NP and sonication, respectively.

First, empty PS-b-PEO and PCL-b-PEO control micelles were synthesized, evaluated via TEM, and their particle size distributions determined (Supplementary Figures S1, S2; Supplementary Table S2). For both BCPs, empty micelles synthesized via EM-NP had mean Feret lengths,  $L_F$ , of ~ 20 nm in THF, consistent with our prior results (Lee et al., 2019); however, micelles with PS BCPs were statistically smaller than those with PCL BCPs. Micelles synthesized in 1:1 THF:DMSO (i.e., used for SAHA synthesis) were ~30 nm, which was statistically larger than those synthesized in THF alone (p < p0.0001). Polydispersity ranged from 0.13 to 0.23, with higher values in mixed solvent vs. pure THF (Supplementary Table S2). Nanoparticle size is determined by the ratio of mixing time  $(\tau_{mix})$ to BCP aggregation time ( $\tau_{agg}$ ). If  $\tau_{agg} < \tau_{mix}$  mass transfer limitations result in regional inhomogeneities that can broaden PSDs and lead to larger NPs (Johnson and Prud'homme, 2003a). When  $\tau_{agg} > \tau_{mix}$  a homogenous kinetics regime is obtained in which NP size is no longer correlated to mixing rate and uniform concentration profiles are obtained. NP size and polydispersity are minimized. DMSO is more viscous than THF at the concentrations employed, which would reduce mixing intensity and could explain the larger size and polydispersity observed here. Alternatively, DMSO could alter the magnitude of BCP supersaturation. According to  $\delta_{H}$  and  $\delta_{tot}$  HSPs (Supplementary Table S1), DMSO has lower compatibility (i.e., greater separation in values) than THF for the hydrophobic BCP blocks, which would increase BCP supersaturation compared to THF alone. Increased supersaturation lowers  $\tau_{agg}$ , which would facilitate nonhomogenous concentration profiles under identical mixing conditions. Both likely contribute to the observed increase in size and dispersity in mixed solvent.

Comparing samples synthesized using sonication to EM-NP, empty micelles synthesized *via* sonication in THF were larger (p < 0.0001) (**Supplementary Figures S2A,C**) with mean L<sub>F</sub> of ~ 46 nm for PS-*b*-PEO and ~ 35 nm for PCL-*b*-PEO and had larger polydispersities, 0.32 and 0.19 for each polymer, respectively, than EM-NP synthesis (**Supplementary Table S2**). These results

<sup>&</sup>lt;sup>1</sup>www.chemspider.com



suggest that  $\tau_{mix}$  was lower in EM-NP and that a homogeneous kinetics regime with minimized size and polydispersity could be achieved. Interestingly, in sonication, micelles synthesized with PS-b-PEO were larger and more polydisperse than those synthesized using PCL-b-PEO, although size differences between these polymers could not be detected in EM-NP. Larger size can result from regional differences in concentration, particularly when  $\tau_{agg} < \tau_{mix}$  and  $\delta_{H}$  and  $\delta_{tot}$ indicate less compatibility of PS blocks with the aqueous phase than PCL blocks (Table 1). Thus, it is possible that larger size resulted from increased supersaturation combined with insufficient mixing. It is also possible that low particle sizes in EM-NP result from kinetic trapping of metastable structures (Thanh et al., 2014; Johnson and Prud'homme, 2003b), whereas slower formation in sonication may permit greater access to thermodynamically favored structures. Sizes for empty micelles synthesized in TMF:DMSO mixed solvent via sonication could not be obtained because complex morphologies not indicative of micelles or NPs resulted (Supplementary Figures S2B,D). This further supports observations in EM-NP that DMSO either increases  $\tau_{mix}$  through increased viscosity or decreases  $\tau_{agg}$  by reducing hydrophobic BCP block compatibility.

Next, nanocarriers containing drug were synthesized *via* both processes and compared. In EM-NP, drug carrier sizes were statistically different for carriers synthesized with PS vs. PCL blocks (Figure 3; Supplementary Figure S3; Supplementary Table S3). Carriers were larger than empty micelles, except for DEX in PCL-*b*-PEO and SAHA in PS-*b*-PEO (Supplementary Table S2). Increased size with encapsulant loading can be attributed to nucleation of encapsulant aggregates that are stabilized by BCP absorption (Johnson and Prud'homme, 2003a; Nabar et al., 2018a). Size differences were also observed across drug types (Supplementary Table S3), with nanocarrier

sizes generally increasing as coumarin 6 < DEX < lutein/SAHA. Coumarin 6 and DEX have similar, steroidal chemical structures (**Figure 2**) that are more compact than lutein and SAHA, which contain long aliphatic regions. Unfortunately, SAHA is not fully soluble in THF and was synthesized with DMSO as a co-solvent. As DMSO increases empty micelle sizes (**Supplementary Table S2**), comparison of the two nanocarriers is not appropriate and size correlation to aliphatic content was not attempted.

Comparing EM-NP nanocarrier sizes to those synthesized via sonication (Figures 3 vs 4, Supplementary Figures 3 vs 4, Supplementary Table S3), coumarin 6 and DEX displayed similar trends to those observed in empty micelles (Supplementary Table S2), with sizes increased for sonication processes compared to EM-NP (p < 0.001). However, polydispersities were relatively similar for both processes. Lutein and SAHA displayed no correlation between synthesis process and size. However, there was a correlation with polymer type; PCL-b-PEO lutein sonication samples were smaller than EM-NP samples (and vice versa for PS-b-PEO) (p < 0.001). Polydispersities between both processes also remained similar or showed no correlation. These results underscore the complexity of nanocarrier formation processes, which depend on several time scales, including  $\tau_{agg}$ ,  $\tau_{drug}$  (hydrophobic drug aggregation times), and drug-polymer association times.  $\tau_{agg}$  and  $\tau_{drug}$  must be larger than  $\tau_{mix}$  to ensure operation in the homogenous kinetics regime (Johnson and Prud'homme, 2003b). Additionally, drug-polymer association times will dictate whether nanocarriers form by drug-polymer association and then BCP aggregation or via drug aggregation followed by drug-polymer association. The latter can lead to significantly larger nanocarriers whose size is dictated by the drug aggregate size (Nabar et al., 2018b). The timescales  $\tau_{drug}$  and  $\tau_{agg}$  can be manipulated by changing the degree of drug and polymer



FIGURE 4 Size distributions and lognormal fits of (A–D) PS-b-PEO NPs and (E–H) PCL-b-PEO NPs synthesized via sonication and encapsulating (A,E) Coumarin 6, (B,F), DEX, (C,G) Lutein, and (D,H) SAHA. Inset: sample TEM image; scale bar: 100 nm. Full size versions of TEM images are available as **Supplementary Figure S4**.



supersaturation, respectively, to control encapsulation processes (Mahajan and Kirwan, 1994).

# Drug Encapsulation Efficiency in BCP Nanocarriers Synthesized Using EM-NP Versus Batch Sonication

Next, we evaluated drug EE for each carrier type synthesized *via* EM-NP and sonication (**Figure 5**, **Supplementary Table S4**). In EM-NP, PS-*b*-PEO generally displayed lower or statistically equivalent EE performance compared to PCL-*b*-PEO BCPs. It has been hypothesized that EE is driven largely by  $\delta_{\rm H}$  compatibility (Zhang et al., 2009), and the PS BCP block displays no hydrogen bonding capacity (i.e.,  $\delta_{\rm H} = 0$ ), which may explain its poorer performance. Remarkably, very high encapsulation efficiencies were observed for lutein and SAHA,

which both contain long aliphatic regions (Figure 2), whereas minimal encapsulation in either polymer was observed for steroidal coumarin 6 and DEX compounds. These differences were abrogated in sonication synthesis, although PCL generally outperformed PS as observed in EM-NP. Lutein and SAHA PCLb-PEO nanocarriers synthesized via EM-NP, but not sonication, also demonstrated significant size increases compared to coumarin 6 and DEX carriers (Supplementary Table S3). Previous studies have indicated an association between increased EE and larger NP size (Dai et al., 2015). These observations suggest a potential formation mechanism in which drug aggregates are passivated by PCL-b-PEO adsorption. The long aliphatic regions of lutein and SAHA likely promote slower aggregation (higher  $\tau_{drug}$ ) than that of steroidal compounds, which may stabilize rapidly through  $\pi$ - $\pi$ stacking interactions (Akbulut et al., 2009). Growing aggregates



can be stabilized by PCL adsorption through favorable drugpolymer interactions and/or slower  $\tau_{agg}$ . With its low hydrogen bonding capacity, PS-*b*-PEO is unable to adequately stabilize growing aggregates of either type, resulting in its poor EE. This result suggests that the insufficient mixing observed in sonication processes, and the corresponding failure to achieve the homogenous kinetics regime, prevented efficient encapsulation of aliphatic hydrophobic compounds by sonication. Because of the complexity of EM-NP process, it is difficult to determine its associated  $\tau_{mix}$ . In addition, determining  $\tau_{drug}$  for each compound is beyond the scope of this work. However, these results suggest that EM-NP can enhance encapsulation efficiency, particularly for aliphatic compounds, by enhancing mixing.

## EM-NP Versus Jet Mixing Reactor Synthesis

Next, we compared performance of EM-NP to FNP processes in a micromixer [e.g., similar to (Ranadive et al., 2019; Johnson and Prud'homme, 2003b)] using a jet-mixing reactor (JMR) previously employed for silver nanoparticle synthesis (Holunga et al., 2005). The EM-NP system operates in semi-batch, whereas the JMR is a continuous flow system. Thus, these experiments assess the effect of semi-batch versus continuous operation. EM-NP operates at low organic:aqueous ratios, which decrease NP size in the homogenous kinetics regime and can potentially influence EE (Miladi et al., 2015). Thus, we utilized FNP conditions that matched organic:aqueous ratios of EM-NP at the conclusion of spray. These experiments were performed using coumarin 6 as a model encapsulant at drug: polymer ratios of 1.45 for PS-b-PEO and 3.64 for PCL-b-PEO. These ratios were much higher than those employed above and were increased to maximize EE for comparison to FNP systems.

Results for both processes were similar across polymer types with no statistical differences detected across any group

methods) (i.e., polymers or synthesis (Figure 6. Supplementary Tables S5-S7). This encouraging result suggests similarity between these two processes. In EM-NP, EHD mixing is achieved in a large aqueous sink, whereas JMR achieves mixing in a confined cross-flow geometry. Even though the EM-NP reactor is ~20x larger than the JMR, EHD mixing is rapid enough to produce NPs with high EE. Similarly, despite semi-continuous operation in which BCP and encapsulant supersaturation profiles are changing with time, results were not distinguishable from those obtained in the JMR. In FNP, relatively constant supersaturation is achieved after initial startup, and here EM-NP was performed using short spray times approximating steady state conditions. It is unclear how longer EM-NP operation would influence products. Further refinement of EM-NP into a fully continuous process could reduce these disparities.

# Theoretical Compatibility Parameters and Correlations With EE

In addition to synthesis method (i.e., mixing effects), several variables affect the EE of hydrophobic compounds in polymer NPs, including the size of hydrophobic core, polymerencapsulant, and polymer-solvent/anti-solvent compatibility (Liu et al., 2006). In this study, the collapsed hydrophobic core sizes were relative similar (i.e.,  $R_{\rm g}$  of PS and PCL in water estimated at ~1.182 nm (Drenscko and Loverde, 2017) and ~1.183 nm [Di Pasquale et al., 2014), respectively], thus differences in polymer, drug, and solvent compatibility would be expected to dominate any observed differences. Enhanced drug solubility in a polymer carrier can result from several different chemical interactions, but hydrogen bonding is the most frequently reported for hydrophobic drug carriers (Zhang et al., 2009). Additionally, solubility can be enhanced when drugs minimize unfavorable interactions with polymer, for example, by self-associate through  $\pi$ - $\pi$  stacking (Akbulut et al., 2009). To understand the role of molecular compatibility, we evaluated EE in the context of several theoretical constructs, specifically HSPs (Table 1), including  $\delta_{tot}$  and  $\delta_{H}$ , Hansen solubility spheres (*Ra*) (**Table 2**), and Flory Huggins interaction parameters  $(\chi_{sp})$  (**Table 3**). HSPs include components for dispersive  $\delta_D$ , polar  $\delta_P$ , and hydrogen bonding  $\delta_{\rm H}$  forces for each compound. HSPs that are similar and low *Ra* and  $\chi_{sp}$  values indicate greater compatibility. We evaluated correlations between our observed EE trends for each of these models across our four drug and two BCP panel for nanocarriers synthesized via EM-NP. EE results obtained through sonication were omitted from this analysis as EE might be impacted by poor mixing efficiency, whereas JMR results were incomplete.

### Hansen Solubility Parameters

Affinity of polymers to encapsulants was evaluated using HSPs, *Ra* values, and  $\chi_{sp}$  values (**Tables 1–3**, respectively). For polymers, affinities were calculated for each block type (i.e., PEO and either PS or PCL), and for HSPs differences between each value and total values were calculated (**Table 1**).

First, we evaluated the hypothesis that high polymerencapsulant compatibility, and therefore EE, is observed when  $\delta_{\rm H}$  values of the BCP hydrophobic block and drug are closely matched (Zhang et al., 2009). For all encapsulants tested,  $\Delta \delta_{\rm H}$ values suggest that PCL blocks have greater drug compatibility than PS blocks (Table 1). Experimental results support this hypothesis, as coumarin 6, lutein, and SAHA EEs were higher for PCL-b-PEO vs. PS-b-PEO, and DEX EE showed negligible difference between BCPs (Supplementary Table S4). Hansen  $\Delta \delta_{\rm H}$  differences in PCL blocks were lowest for lutein and highest for DEX suggesting that EE should increase as DEX < SAHA < coumarin 6 < lutein. However, our experimental results did not support this. Whereas lutein did have the highest EE in PCL, SAHA also had an unexpectedly high EE. Higher EE of SAHA may have been influenced by the use of mixed solvent; however, coumarin 6 and DEX EE were similar despite substantial  $\Delta \delta_{\rm H}$ differences. We also investigated the hypothesis that EE and  $\Delta \delta_{tot}$ between drugs and hydrophobic BCP blocks are linearly correlated (Grizić and Lamprecht, 2020), but experimental results did not support this hypothesis. Using  $\Delta \delta_{tot}$ , PCL-b-PEO was predicted to be more compatible with coumarin 6, DEX, and SAHA encapsulants, whereas PS-b-PEO was predicted more compatible with lutein. We did not observe any correlation between  $\Delta \delta_{tot}$  and EE (**Table 1**, **Supplementary Table S4**). Good solubility of drug in a BCP block has been reported to occur when  $\Delta \delta_{\text{tot}} < 5 \text{ (J/cm}^3)^{1/2}$  (Krevelen, 1990); however, coumarin 6 had low  $\Delta\delta_{tot}$  that did not translate to high EE. It has been further suggested that compatibility with both BCP blocks maximizes EE (Latere Dwan'Isa et al., 2007). Using the sum of the absolute value of  $\Delta \delta_{tot}$  for both blocks, the same EE trends are predicted as when using  $\Delta \delta_{tot}$  for the hydrophobic BCP alone, which we did not observe. We also evaluated (poor) compatibility with the antisolvent, water, which we would expect to be the driving force in drug or BCP aggregation given the low organic:aqueous ratios of EM-NP. Although the four encapsulants tested were all hydrophobic and considered insoluble in water, compounds with higher water compatibility may not be encapsulated as efficiently because aggregates formed may be less stable (Akbulut et al., 2009). However, in comparing drug-water  $\Delta \delta_{\rm H}$ and  $\Delta \delta_{tot}$  and EE data, no clear trends are observed (Table 1, Supplementary Table S4). HSPs  $\Delta \delta_{H}$  and  $\Delta \delta_{tot}$  were predictive of lower PS compatibility in water, which would translate to lower  $\tau_{agg}$  and potentially lower EE as BCPs could potentially aggregate before interacting with drug molecules, and PS BCP EE were lower than those of PCL BCPs. Thus,  $\Delta \delta_H$  were predictive of polymer EE trends, but not predictive of EE trends between drug structures, and  $\Delta \delta_{tot}$  for hydrophobic BCP blocks, the full BCP, or the anti-solvent were not predictive of EE trends.

### Hansen Interaction Spheres

In addition to HSPs, compatibility of two molecules can be assessed in three-dimensional Hansen space using the Hansen solubility parameter distance, *Ra.* Smaller *Ra* values indicate greater compatibility. *Ra* values suggest greater drug compatibility in PCL versus PS BCP blocks (**Table 2**), consistent with experimental EE observations (**Supplementary Table S4**). *Ra* values for BCPs suggest PS has lower compatibility, which would suggest faster  $\tau_{agg}$  and potentially less ability to passivate growing drug aggregates. These data are all supported by the lower EE observed in PS BCPs. For PS, EE was predicted by *Ra* to scale as DEX < SAHA < coumarin 6 < lutein and for PCL as DEX < SAHA < lutein < coumarin 6. This did not match our experiment observations (**Supplementary Table S4**). Despite spanning the predicted range, DEX and coumarin 6 EE in PCL-*b*-PEO were only different by only 1% and not statistically significant ( $\alpha = 0.05$ ). When PEO is considered in addition to the hydrophobic BCP blocks, coumarin 6 in PCL is predicted to have the highest EE, which we did not observe. Nor were any trends observed for drug-water *Ra* values and EE (**Table 2**). Hence, *Ra* values were not predictive of EE experimental trends.

## **Flory-Huggins Interaction Parameters**

Another factor that can influence EE and that is, not included in HSPs or *Ra* calculations is the bulkiness of drug molecules. The Flory Huggins interaction parameter,  $\chi_{sp}$ , includes a molecular volume component,  $v_s$ , that accounts for drug bulkiness. As for *Ra*, lower  $\chi_{sp}$  indicates higher compatibility.  $\chi_{sp}$  values were calculated for each drug in combination with both BCP blocks (i.e., PEO and either PS or PCL) and the water anti-solvent (**Table 3**).

Flory Huggins parameters indicate greater compatibility with all drugs for PCL than PS, consistent with our EE observations (Supplementary Table S4). Further, DEX had relatively low compatibility with either polymer, which is in a good agreement with EE results. The highest compatibility was predicted for coumarin 6 in PCL; however, it displayed lower EE than lutein. Thus,  $\chi_{sp}$  values for hydrophobic BCP blocks alone were not predictive of trends observed between drugs. This could potentially be explained by considering off target association with PEO, as coumarin 6 had high compatibility with PEO blocks as well. However, this logic would also predict poor SAHA encapsulation, which was not observed, although EE was lower expected based on high compatibility with PCL. No trends were observed for drugwater  $\chi$  values and EE. Collectively, these results indicate a qualitative relationship at best between  $\chi$  values and EE trends. Similar to HSPs, Flory Huggins parameters were predictive of polymer preference, but not predictive of EE trends among drugs.

## **Role of Polymer:Drug Molar Ratio**

In the prior experiments, EE was evaluated for a fixed polymer: drug molar ratio, selected to be low to enable differences between drug, polymer, and solvent interactions to be assessed. However, it is recognized that increasing drug concentration in the organic solution can dramatically enhance EE. Thus, we next evaluated the effect of increasing polymer:drug molar ratio on EE using coumarin 6 as a model drug. In these experiments, coumarin 6 concentration was held constant at 0.1  $\mu$ mol, whereas polymer concentration was varied to generate different molar ratios ranging from 0.05–7.28 for PCL and 0.02–2.91 for PS (**Figure 7**; **Supplementary Tables S6, S7**). For comparison, values of 0.18 and 0.072 were used in our prior EM-NP vs.



sonication experiments, and values of 3.64 and 1.45 were used for our EM-NP vs. FNP experiments, for PCL and PS, respectively.

First, we note that in the absence of polymer stabilizer (i.e., polymer:drug ratio = 0), coumarin-6 aggregates form that are sufficiently large to be entirely removed during purification steps. Thus, BCP is required for drug stabilization. At low polymer to coumarin 6 ratios of ~0.02–0.09 (i.e., drug in excess), EE was very low (i.e., from 0.3–4%). However, EE steadily increased to a saturation value at polymer:drug ratios of ~3.6 for PCL-*b*-PEO (EE:  $51.3 \pm 8.49\%$ ) and ~1.5 for PS-*b*-PEO (EE:  $43.9 \pm 7.14\%$ ), representing a breakpoint. After this point, higher polymer:drug ratios did not yield a statistically significant increase in EE.

This response resembles a Langmuir adsorption processes, further supporting a formation mechanism in which drug aggregates are stabilized by BCP adsorption. As the drug concentration in these experiments is fixed,  $\tau_{drug}$  should remain relatively constant (i.e., baring changes in solution viscosity), whereas drug-polymer association time and  $\tau_{agg}$ would be decreased at increasing ratio [i.e., higher polymer concentration and supersaturation (Johnson and Prud'homme, 2003)]. At low polymer:drug ratios, insufficient polymer is present to stabilize the growing drug aggregate, which will eventually precipitate from solution. We observed this phenomenon during centrifugal purification of these samples, with large losses on the filter membrane filters. As polymer:drug ratio increases, polymer chains are increasingly able to stabilize and ultimately saturate the coumarin 6 aggregate surface. At the breakpoint, the growth of coumarin 6 aggregates is quenched by adsorption of BCPs on aggregate surface, representing a condition in which  $\tau_{drug}$  and  $\tau_{agg}$  are approximately equivalent (Johnson and Prud'homme, 2003b).

Both polymers exhibited similar EE maxima, although as predicted by compatibility factors, PCL was slightly higher than PS (~51 vs. ~44%). However, at these high polymer:drug ratios, differences between polymer-drug compatibility were largely minimized, enabling high EE to be obtained. This encouraging result suggests greater latitude in nanocarrier BCP selection is possible if high polymer concentrations are employed relative to drug. However, although similar EE maxima were observed, the breakpoints at which these behaviors occurred differed.  $\tau_{agg}$  is reduced with increasing BCP hydrophobicity (i.e., PS or PCL) (Johnson, 2003), and is dependent on molecular weight of the hydrophobic block. Since the molecular weight of the PS BCP block was ~1.5 times that of the PCL block and PS has less compatibility with the water anti-solvent (i.e., greater differences in  $\delta_{tot}$  and  $\delta_{H}$ ), PS-*b*-PEO  $\tau_{agg}$  will be lower, consistent with its breakpoint positioned at a lower polymer: drug ratio. Thus, whereas high and relatively equivalent EE can be obtained for either polymer, this occurs at a lower polymer: drug ratio for more hydrophobic polymers. However, result should be interpreted with some caution as different polymer: drug ratios were employed for PS and PCL studies. Further experiments at different ratios would enhance these findings.

Because increased drug loading can also affect NP size (Johnson and Prud'homme, 2003a; Nabar et al., 2018a), we also characterized

**TABLE 4** Size characteristics of Coumarin 6 loaded PS-*b*-PEO and PCL-*b*-PEO NPs synthesized at the breakpoint at which drug EE no longer increases with increasing polymer:drug ratio.

|                                  | PS                   | PCL                          |
|----------------------------------|----------------------|------------------------------|
| Min L <sub>F</sub> (nm)          | 5.6                  | 10.6                         |
| Max L <sub>F</sub> (nm)          | 137.7                | 37.9                         |
| Mode L <sub>F</sub> (nm)         | 25.8                 | 17.6                         |
| L <sub>F-dev</sub> (nm)          | 27.2 <sup>+5.6</sup> | 18.6 <sup>+4.1</sup><br>-3.4 |
| PD <sub>eff</sub>                | 0.19                 | 0.20                         |
| Spheres (AR < 1.3) % by N        | 59.1                 | 78.6                         |
| Ellipses (1.3 < AR < 2.0) % by N | 28.0                 | 20.7                         |
| Worms (AR < 1.3) % by N          | 12.9                 | 0.7                          |
|                                  |                      |                              |

Polymer: drug molar ratio employed: 1.45 for PS-b-PEO and 3.64 for PCL-b-PEO. AR = aspect ratio, % by N = number frequency, LF = Feret length, +, – = the interval defined by the upper and lower bounds on <L<sub>E</sub>> containing 68% of the particles.

NP sizes at the Langmuir polymer:drug molar ratio breakpoints (i.e., 1.45 for PS-b-PEO and 3.64 for PCL-b-PEO) (Figures 7C,D; Table 4). For PS BCPs, nanocarrier sizes were statistically larger to those observed at low polymer:drug ratio (Supplementary Table S3), whereas for PCL BCP nanocarriers sizes at the break point were slightly smaller (p < 0.001). This may result from faster stabilization of drug aggregates limiting their size. However, despite these encouraging results, we did observe a greater number of wormlike structures (Figures 7E,F), particular for PS BCPs. Thus, morphology should be considered in optimizing polymer:drug molar ratios. It is likely that an optimum occurs near the breakpoint in which high EE with spherical morphology can be obtained. We also note that although a particular polymer: drug ratio may be employed during synthesis, the nanocarriers produced can be concentrated or diluted as needed. Drug release and toxicity behaviors would have to be further explored at the concentration of intended use.

# CONCLUSION

In this report, we evaluated sizes and EE of four different drugs (i.e., coumarin 6, DEX, SAHA, and lutein) in two BCPs (i.e., PCL-b-PEO and PS-b-PEO) using the EM-NP process, nanoprecipitation via batch sonication, and FNP in a JMR. A primary goal of our study was to assess drug: polymer compatibility as a determinant of EE using Hansen solubility parameters (HSPs), Hansen interaction spheres (*Ra*), and Flory Huggins interaction parameters ( $\chi_{sp}$ ). However, only weak correlations between HSP drug-polymer  $\Delta\delta_{\rm H}$ ,  $\Delta\delta_{\rm tot}$ , and  $\chi_{sp}$  and drug preference for a given polymer were observed. These data are consistent with previous reports (Sunoqrot et al., 2017; Latere Dwan'Isa et al., 2007; Grizić and Lamprecht, 2020; Shin et al., 2018; Meunier et al., 2017) and support the hypothesis that solubility parameters are unsuitable for predicting EE because they do not include entropic contributions or concentration effects in their calculations (Turpin et al., 2018). To evaluate concentration effects, we next examined EE as a function of polymer: drug ratio. Polymer: drug ratio was revealed as a far more important determinant of EE than differences in polymer-drug chemical compatibility. Thus, solubility parameters will likely need to be augmented with more complex modeling approaches

(Turpin et al., 2018; Sun et al., 2020) to capture the relationship between polymer and drug characteristics and EE. However, there are some important limitations of this work. First, only four drugs and two polymers were investigated, and only one drug was used in polymer:drug ratio studies. Additional combinations would strengthen the conclusions made here. A significant focus of this work was in optimizing EE, but EE does not necessarily translate to optimal drug delivery. In fact, high EE often results in slower release of less encapsulated drug (Sahu et al., 2013; Sunoqrot et al., 2017) because the same drug-polymer affinity that drives encapsulation prevents dissociation. Additional work exploring drug release kinetics from these systems, particularly above the breakpoint would further guide drug nanocarrier design. Nor does this study evaluate therapeutic efficacy. Further work will be required to evaluate drug aggregation, degradation, and activity upon release from any proposed drug carrier. Further, toxicity of any nanocarrier should be carefully assessed before use. These experiments demonstrate that polymer:drug ratio is an important determinant of EE and should be carefully optimized in nanocarrier design.

# DATA AVAILABILITY STATEMENT

The raw data supporting the conclusion of this article will be made available by the authors, without undue reservation.

# AUTHOR CONTRIBUTIONS

KL, FK, LC, and GY synthesized and characterized nanocarriers. FK performed JMR studies and studies at increased polymer:drug ratio. KL, FK, and JW analyzed data. KL and FK prepared the initial manuscript draft, which was edited by JW. All authors have edited, contributed to, and approved the final manuscript.

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# SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fnano.2021.719710/full#supplementary-material

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