



# The kinetics of aggregation of poly-glutamic acid based polypeptides

Martin Colaco, Jun Park, Harvey Blanch\*

Department of Chemical Engineering, University of California Berkeley, Berkeley, CA 94720, United States

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## ABSTRACT

The aggregation of two negatively-charged polypeptides, poly-L-glutamic acid (PE) and a copolymer of poly-glutamic acid and poly-alanine (PEA), has been studied at different peptide and salt concentrations and solution pH conditions. The kinetics of aggregation were based on Thioflavin T (ThT) fluorescence measurements. The observed lag phase shortened and the aggregation was faster as the pH approached the polypeptides' isoelectric points. While the initial polypeptide structures of PE and PEA appeared identical as determined from circular dichroism spectroscopy, the final aggregate morphology differed; PE assumed large twisted lamellar structures and the PEA formed typical amyloid-like fibrils, although both contained extensive  $\beta$ -sheet structure. Differences in aggregation behavior were observed for the two polypeptides as a function of salt concentration; aggregation progressed more slowly for PE and more quickly for PEA with increasing salt concentration. Several models of aggregation kinetics were fit to the data. No model yielded consistent rate constants or a critical nucleus size. A modified nucleated polymerization model was developed based on that of Powers and Powers [E.T. Powers, D.L. Powers, The kinetics of nucleated polymerizations at high concentrations: Amyloid fibril formation near and above the "supercritical concentration", *Biophys. J.* 91 (2006) 122–132], which incorporated the ability of oligomeric species to interact. This provided a best fit to the experimental data.

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## 1. Introduction

Protein folding is important for cellular function and has been the subject of extensive research [2–4]. Protein misfolding into inactive forms and aggregates can also occur. Proteins can assemble to form two different types of aggregates: disordered and ordered. While disordered aggregates have important consequences in pharmaceutical production, stabilization, and delivery, the ability of proteins and polypeptides to form ordered aggregates has been linked to disease *in vivo* and also to potential technological applications [5–9]. Ordered aggregates can form high aspect ratio amyloid fibrils that often exhibit enhanced stability to pH and temperature fluctuations compared to native protein structures [9–11]. While the amino acid sequence, overall morphology, and sizes of fibrils varies, all amyloids have a common cross  $\beta$ -sheet structure, as confirmed by X-ray diffraction (XRD) [12].

Studies on the aggregation process have included characterizing natural amyloids, determining non-native peptide sequences that aggregate [13,14], characterizing the effect of co-solvents and pH [15,16], and salt [17] on aggregate formation, and computer simulations to understand the thermodynamics [18,19] and kinetics of aggregation [1,20,21]. While only a limited number of protein sequences leading to amyloid fibril formation have been found in nature, it has been shown that synthetic proteins and peptides can form amyloid fibrils under certain conditions, indicating that amyloid fibril formation is a general property of the peptide backbone and not linked only to specific side

chain sequences [22,23]. In particular, Fandrich and Dobson showed that even large chain, hydrophilic polypeptides of poly-glutamate, where electrostatic repulsions prevent ordered aggregation at near physiological pH, can form ordered aggregates by lowering the pH to the isoelectric point and raising the temperature. Characterization of the morphology of poly-glutamic acid aggregates by X-ray diffraction has determined that they form lamellae that contain extensive  $\beta$ -sheet structure [24,25]. The spacing between  $\beta$ -sheets differs depending on whether the aggregation occurred in the presence of  $\text{Ca}^{2+}$  ions at pH ~5.5 or  $\text{Na}^+$  in 0.1 N HCl [24,25]. However, the effect of salt and pH and on the kinetics and morphology of poly-glutamic acid aggregation has not been examined, either experimentally or computationally.

In this work, we describe the importance of pH, salt type and concentration, peptide concentration and sequence on the kinetics and morphology of aggregates of poly-glutamic acid and a co-polymer of poly-glutamic acid and poly-alanine. The kinetics of aggregation were measured using Thioflavin T (ThT) binding and fluorescence, and the morphology was determined by microscopy. Models of the aggregation process are proposed to evaluate critical nucleus sizes and activation energies.

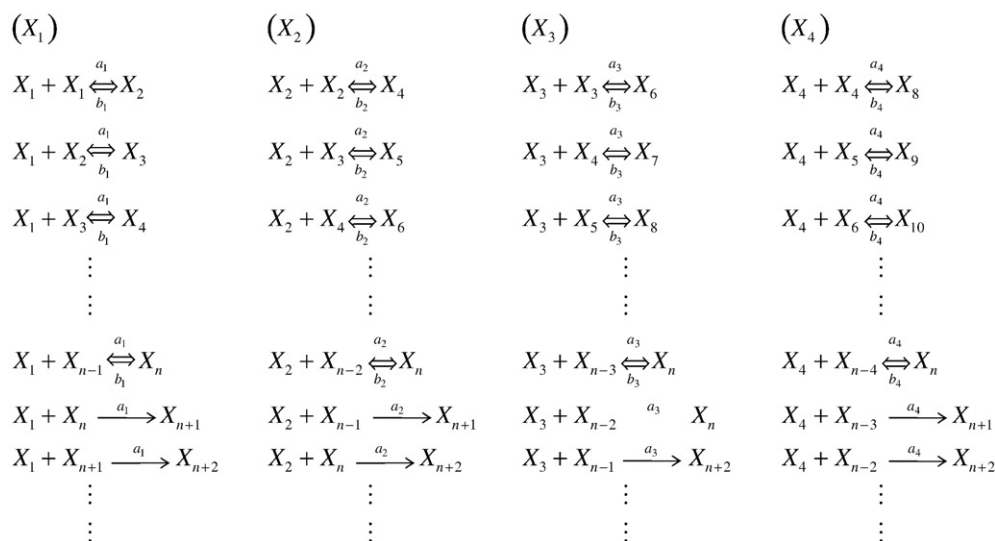
## 2. Materials and methods

### 2.1. Characterization of polypeptide monomers – CD spectroscopy

Circular Dichroism (CD) spectroscopy was used to characterize the secondary structure of polypeptide monomers and performed on an Aviv Biomedicals Circular Dichroism Spectrometer Model

\* Tel.: +1 510 642 1387; fax: +1 510 643 1228.

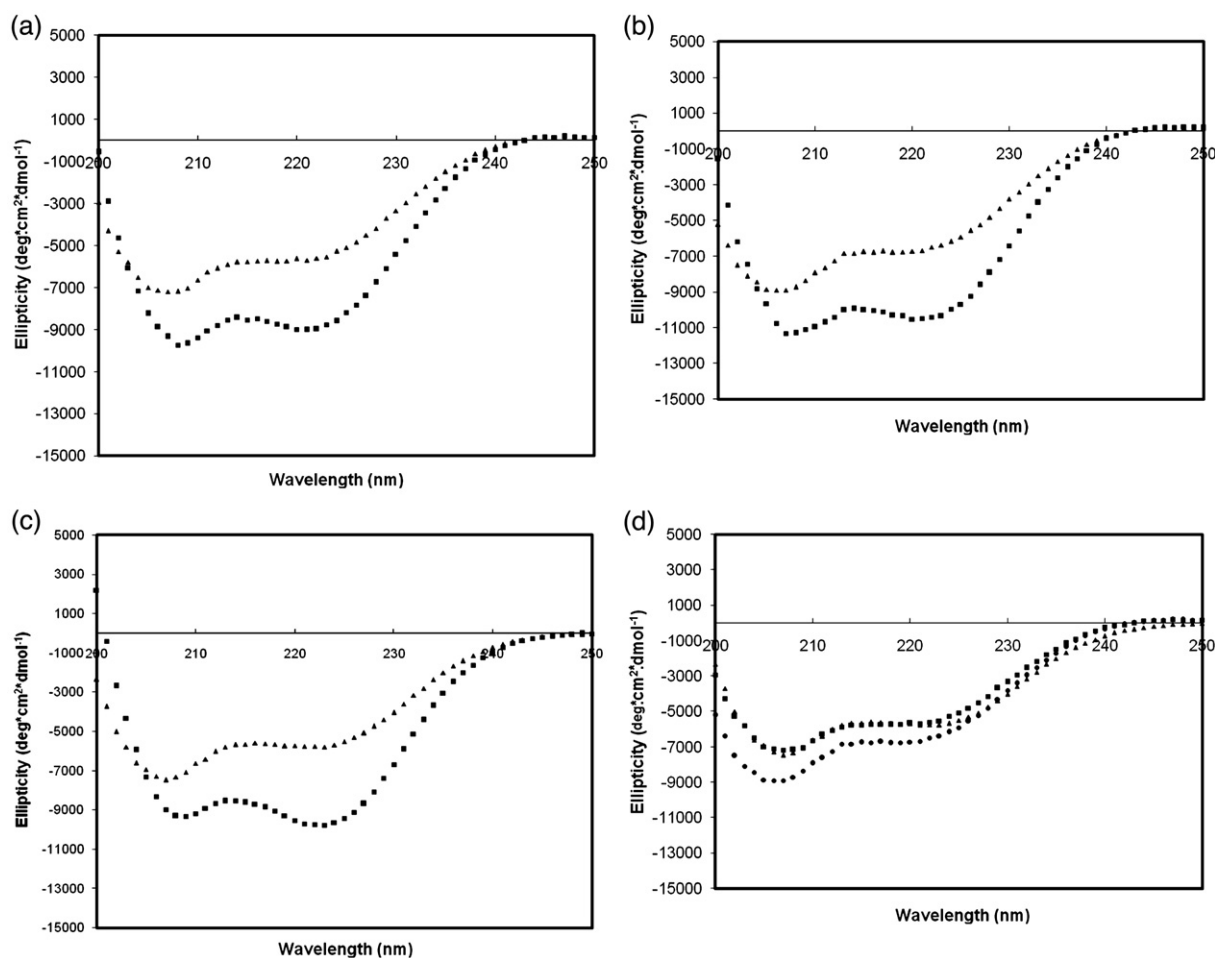
E-mail address: [blanch@berkeley.edu](mailto:blanch@berkeley.edu) (H. Blanch).



**Fig. 1.** Generalized reaction scheme for a modified nucleated polymerization where oligomers are allowed to interact with each other and fibrils. Presented here are reactions for monomers, dimers, trimers, and tetramers with respect to a general nucleus size,  $n$ . For brevity, larger oligomers have not been presented here. Note, if the species on the right is larger than the nucleus size, the reaction will be treated as irreversible.

62DS. Polypeptide solutions were diluted to 0.5 mg/mL, and 300  $\mu$ L samples were pipetted into a quartz cuvette with a 0.1 cm path length. Measurements were made at both 25  $^{\circ}$ C and 65  $^{\circ}$ C (elevating the temperature and holding for 5 min before measuring) of

scans from 200 to 260 nm. The CD signal was converted to a mean residue ellipticity, with units of  $\text{deg}\cdot\text{cm}^2/\text{dmol}$ , using the mean residual weight, the peptide concentration, and the cuvette path length.

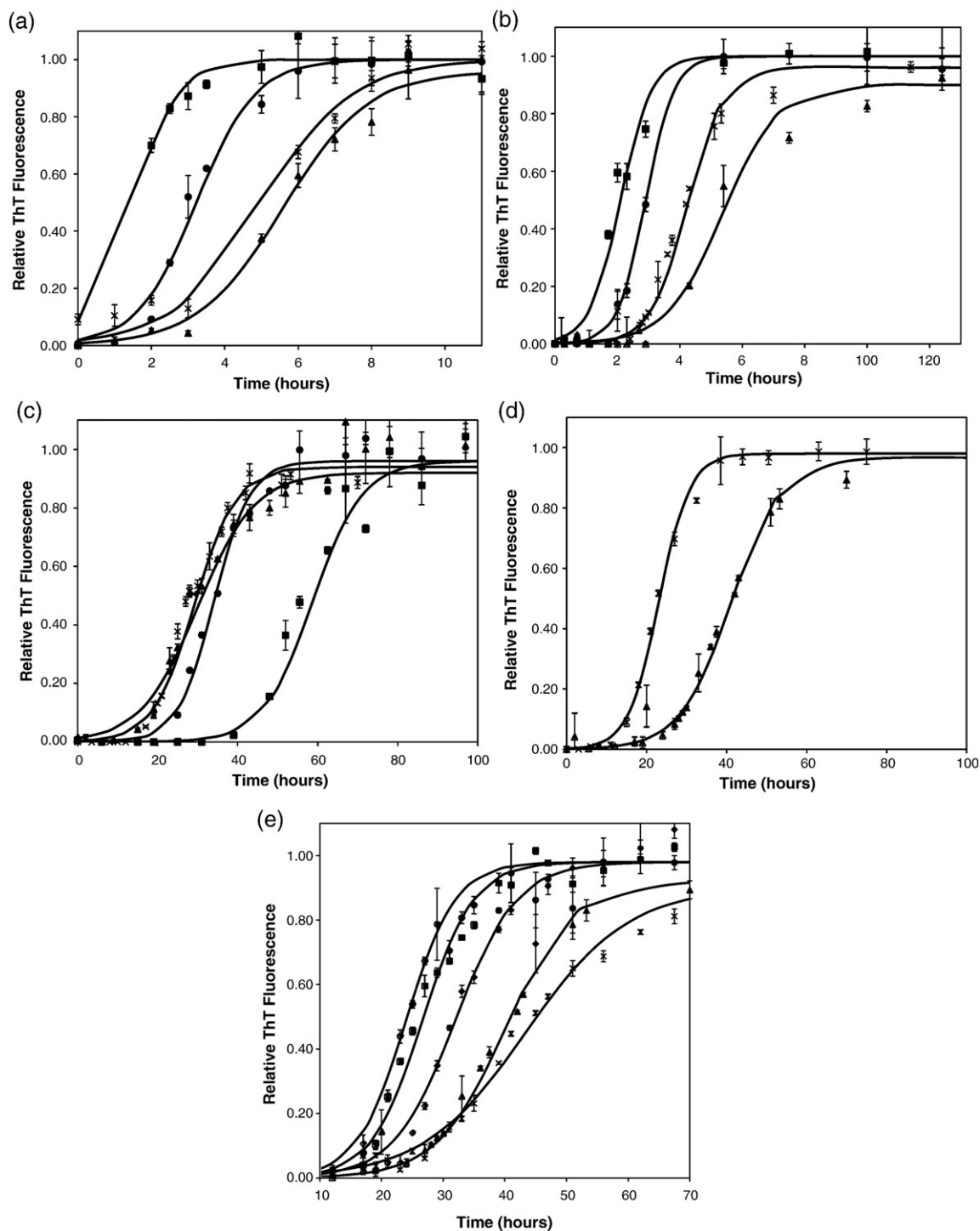


**Fig. 2.** CD Spectra of 0.5 mg/mL polypeptides in 25 mM sodium propionate for (a) PE at pH ~3.6, (b) PE at pH ~4.1, (c) PEA at pH ~3.6, and (d) PE and PEA at 65  $^{\circ}$ C. For (a)–(c), squares are at 25  $^{\circ}$ C, and triangles are at 65  $^{\circ}$ C. For d, squares are for PE at pH ~3.6, circles are for PE at pH ~4.1, and triangles are for PEA at pH ~3.6.

## 2.2. Aggregation procedure

Poly-L-glutamic acid sodium salt (MW~4100, about 27aa) and poly(Glu:Ala) 6:4 sodium salt (MW~19,400, about 163aa) were purchased from Sigma-Aldrich and used without further purification. Salt solutions of 100 mM, 50 mM, 10 mM or no salt were adjusted to pH 3.1, 3.6, 4.1, or 4.6 with small quantities of 1 M or concentrated HCl. The polypeptides were weighed to make 5 to 10 mL of 1 mg/mL solutions. The solutions were sonicated for 5 min with a Branson

Sonifier 450 at 50% output until the solution was clear and the polypeptides were fully dissolved. The polypeptide solutions were filtered and then placed in a 65 °C oven, and the aggregation was allowed to proceed for up to 1 month. For experiments to determine the importance of seeding, aliquots of solutions were saved and frozen at -20 °C for later experiments. Only aliquots taken when solutions were exhibiting ThT fluorescence above baseline but below the maximal value for the aggregated solution were used for preformed seeding experiments.



**Fig. 3.** Effect of salt type, concentration, and seeding on polypeptide aggregation. Polypeptide aggregation as a function of salt concentration in sodium acetate for (a) PE at pH ~3.6, (b) PE at pH ~4.1, and (c) PEA at pH ~3.6. Squares are no salt, circles are 10 mM, crosses are 50 mM, triangles are 100 mM. (d) PE pH ~4.1 as a function of seeding in 50 mM sodium acetate. Crosses are seeded, triangles are unseeded. (e) PE in 50 mM salt at pH ~4.1. Circles are KNO<sub>3</sub>, squares are K<sub>2</sub>HPO<sub>4</sub>, diamonds are NaNO<sub>3</sub>, triangles are NaAc, and crosses are MgSO<sub>4</sub>. Solid fit lines for (a)–(d) are based on a hyperbolic tangent with the center shifted from the origin.

### 2.3. Thioflavin T fluorescence measurements

The fluorescence of bound Thioflavin T and Congo Red are common methods to track the growth of amyloid-like aggregates over time. ThT molecules fluoresce more strongly when they are bound in a planar configuration than when they are free in solution and can bind in the fold of an exposed  $\beta$ -sheet along the main fibril axis [26]. Thus, strong ThT fluorescence indicates the presence of  $\beta$ -sheet structure. Fluorescence methods have been most commonly used to qualitatively determine the presence or absence of amyloids, and recent work has verified that ThT fluorescence varies linearly with fibril concentration [27]. Although one single ThT binding curve as a function of time does not provide sufficient information to determine the species size distribution (as could be obtained from dynamic light scattering), it is likely that only species larger than a critical size contribute to the overall ThT fluorescence. This feature of ThT fluorescence is significant when comparing kinetic data to the mathematical models presented later, as a critical nucleus size does not have to be estimated and all aggregates larger than the nucleus can be determined by ThT binding.

ThT was purchased from Sigma. Stock solutions of 250  $\mu$ M were prepared daily by dissolving ThT in 20 mL of deionized (DI) water. These stock solutions were wrapped in foil in stored at 4  $^{\circ}$ C. Working solutions were prepared as needed by mixing 2.5 mL of filtered stock solution with 2.5 mL of 25  $\mu$ M sodium phosphate (pH  $\sim$ 6.5) and 20 mL of DI water. The pH of the working solution was adjusted by adding 6 drops of 1 M HCl to lower the pH between 3.7 and 4.0. This working solution was covered in foil when not in use.

ThT fluorescence measurements were made on a Molecular Devices SpectraMax M2 plate reader with excitation at 440 nm and emission measurements made at 490 nm. Solutions were thoroughly mixed in individual wells of an opaque 96-well plate immediately prior to measurements. Triplicate measurements of 20  $\mu$ L of peptide solution mixed with 200  $\mu$ L of working ThT solution were made for each time point. Additionally, control measurements of either 200  $\mu$ L of peptide solution, made after sonication and before placing the solution in the 65  $^{\circ}$ C oven, or 200  $\mu$ L of working ThT solution, made periodically during the aggregation, were performed. Relative ThT fluorescence values consisted of subtracting the combined baseline of peptide alone (usually around 20–25AU) and ThT alone (usually around 70–90AU) fluorescence values from the measurement and scaling by a baseline average maximum value once the ThT fluorescence achieved a constant value.

### 2.4. Characterization of aggregate morphology

Three microscopies were used to characterize the size and morphology of the polypeptide aggregates: scanning electron (SEM), transmission electron (TEM), and atomic force (AFM). In all cases, adsorption of the fibrils onto a surface proved difficult; therefore a 0.1 wt.% solution of poly-L-lysine (purchased from Ted Pella and stored under nitrogen at 4  $^{\circ}$ C) was added to the surface for 2 min and dried with nitrogen gas prior to adding the polypeptide solution. For SEM imaging, glass microscope coverslips were rinsed with acetone and water before being dried with nitrogen. For TEM, 400 mesh copper grids were coated with formvar (0.5% in ethylene dichloride floating on water) and carbon and glow discharged prior to use. For AFM, freshly cleaved mica or highly-oriented pyrolytic graphite (HOPG) was used. The precursor surfaces were then coated with poly-L-lysine for 2 min, dried with nitrogen or wicked dry, coated with the polypeptide solution for 5 min, and dried with nitrogen or wicked dry. For SEM, the prepared surfaces were mounted on stubs and sputter coated in a Bal-tec MED 020 Sputter Coater with either a 12–25  $\mu$ m thick IR coating or 30–40  $\mu$ m Pt coating. For TEM, after depositing the peptides on the surface, the grids were rinsed with water, wicked dry, stained with a 0.1–0.2% uranyl acetate for 2 min, wicked dry, and stored overnight before imaging. AFM samples were loaded on a specimen disc and

imaged immediately after peptide deposition. SEM imaging was performed on a Hitachi S-5000 SEM operating at 10 kV. TEM imaging was performed on a FEI Tecnai 12 TEM at 100 kV accelerating voltage. AFM imaging was performed in tapping mode in air on a DI Multimode Scanning Probe Microscope. AFM tips were SiN PointProbe Non-Contact AFM tips with a 20 nm typical radius of curvature. Typical scan sizes were 5–10  $\mu$ m and scan rates were 1–1.5 Hz for attaining both height and phase contrast images.

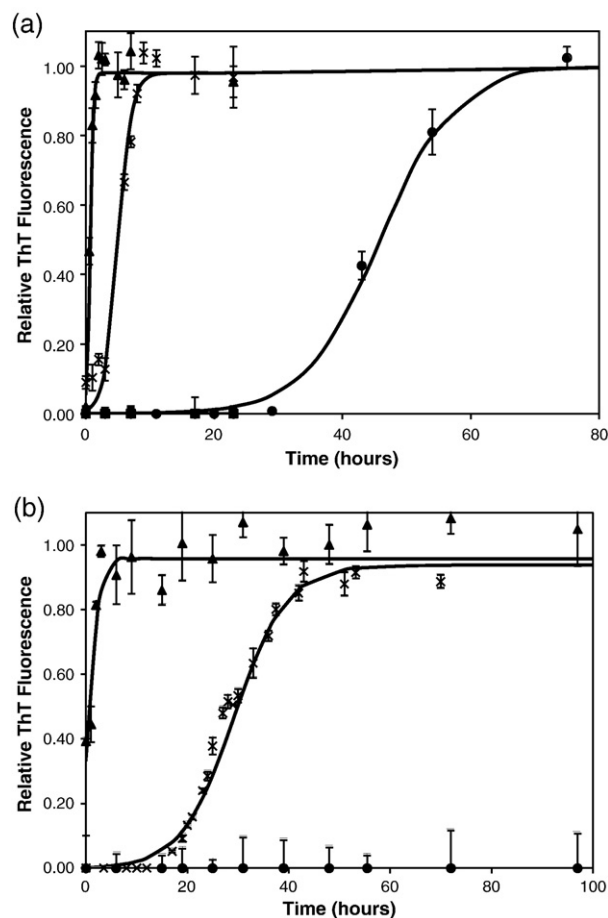
### 3. Models of peptide aggregation

Four models of protein aggregation were considered and their predicted time courses of aggregation were compared with the ThT fluorescence data. The first model was a “random polymerization” model developed by Kodaka [20]. In this model, any size species (monomer, oligomer, and polymer) can react irreversibly with any other species, with each reaction having the same rate constant. An analytical solution to the extent of polymerization is available:

$$\frac{[F]}{[M]_0} = \left\{ 1 - \frac{1}{([M]_0 at + 1)} \right\}^{m-1} \left\{ 1 + \frac{m-1}{([M]_0 at + 1)} \right\} \quad (1)$$

where  $[F]$  is the concentration of monomers in the fibrils,  $[M]_0$  is the initial monomer concentration,  $a$  is the rate constant for addition,  $t$  is the time, and  $m$  is a parameter representing the minimum size of the polymer that is measurable.

The second model is the classical nucleated polymerization model, originally presented by Oosawa and Kasai [28]. This model is based on



**Fig. 4.** Polypeptide aggregation in 50 mM sodium acetate of (a) PE and (b) PEA as a function of pH. Squares are pH 4.6, circles are pH 4.1, crosses are pH 3.6, triangles are pH 3.1. Solid fit lines for (a) and (b) are based on a hyperbolic tangent with the center shifted from the origin.

the following assumptions: aggregates can only grow through monomer addition; the monomer attains a rapid pre-equilibrium with the oligomers; the concentrations of oligomers are low; and the monomer concentration remains high enough throughout the aggregation that dissociation from fibrils can be neglected. In contrast to the random polymerization model, the key feature of this model is the formation of a high-energy nucleus, with a size between the smaller oligomers and larger, detectable fibrils. An analytical solution to the classical nucleated polymerization is:

$$\frac{[M]}{[X]_{\text{tot}}} = \left\{ 1 - \left[ \sec h \left( at \sqrt{\frac{(n+1)[X]_{\text{tot}}^{n+1}}{2K_s^{n-1}}} \right) \right]^{\frac{2}{n+1}} \right\} \quad (2)$$

where  $[M]$  is the fibril mass concentration,  $[X]_{\text{tot}}$  is the total protein concentration,  $a$  is the rate constant for addition,  $t$  is the time,  $n$  is the critical nucleus size, and  $K_s$  is the dissociation constant for the oligomers ( $K_s = b/a$ , where  $b$  is the reverse rate constant for oligomer dissociation and  $a$  is as defined previously).

The third model was developed by Powers and Powers [1] and is a modified version of the classical nucleated polymerization model. In this model, a rapid monomer-oligomer pre-equilibrium is not assumed, nor is the requirement for the monomer concentration to remain high during the aggregation. Instead, three different regimes for polymerization are considered: monomer oligomerization with a dissociation constant  $K_s$  (previously defined), an irreversible monomer addition to the nucleus, and a reversible fibrillization with a dissociation constant of  $K_c$  (the ratio of the rate constant for monomer dissociation from fibrils ( $c$ ) to that for addition ( $a$ )). With the assumption of irreversible addition to the nucleus, the fibrils can be lumped

into one species, and the aggregates can be divided into pre-nuclear oligomers and post-nuclear fibrils. While one forward rate constant for monomer addition,  $a$ , to any species, is assumed, two different reverse rate constants — a backwards rate constant,  $b$ , for dissociation from pre-nuclear oligomers and a smaller backwards rate constant,  $c$ , for dissociation from the more stable post-nuclear fibrils are included. Examining the dissociation constants, three different regimes exist. When the monomer concentration is less than  $K_c$  ( $[X]_{\text{tot}} < K_c$ ), both oligomers and fibrils are more stable than the monomer, and aggregation will not proceed. When  $(K_c) < [X]_{\text{tot}} < K_s$ , the nucleus represents the highest energy species on the reaction pathway as well as being a size at which a dramatic change in growth rates occurs. This regime is indicative of a nucleated polymerization mechanism. The final regime occurs when the monomer concentration is very high ( $[X]_{\text{tot}} > K_s$ ). In this regime, the thermodynamic and structural nucleus is the monomer, no lag phase will occur during the aggregation, and the aggregation will follow classical downhill polymerization kinetics.

### 3.1. A modified model for polypeptide aggregation

A modified reaction scheme, based on nucleated polymerization, is presented in Fig. 1. In this model, aggregation can occur both through monomer addition and through the association of oligomers to other oligomers. This model is thus similar to a “random polymerization” model. For computational ease, only species smaller than the nucleus are considered to react with other species, and fibrils are not assumed to interact. Different forward reaction rate constants can be considered for monomer, dimer, trimer, etc. addition to both pre-nuclear and post-nuclear species. Initially, we assume that these rate constants are the same ( $a_{\text{monomer}} = a_{\text{dimer}} = a_{\text{trimer}}$ , etc.). However, we also

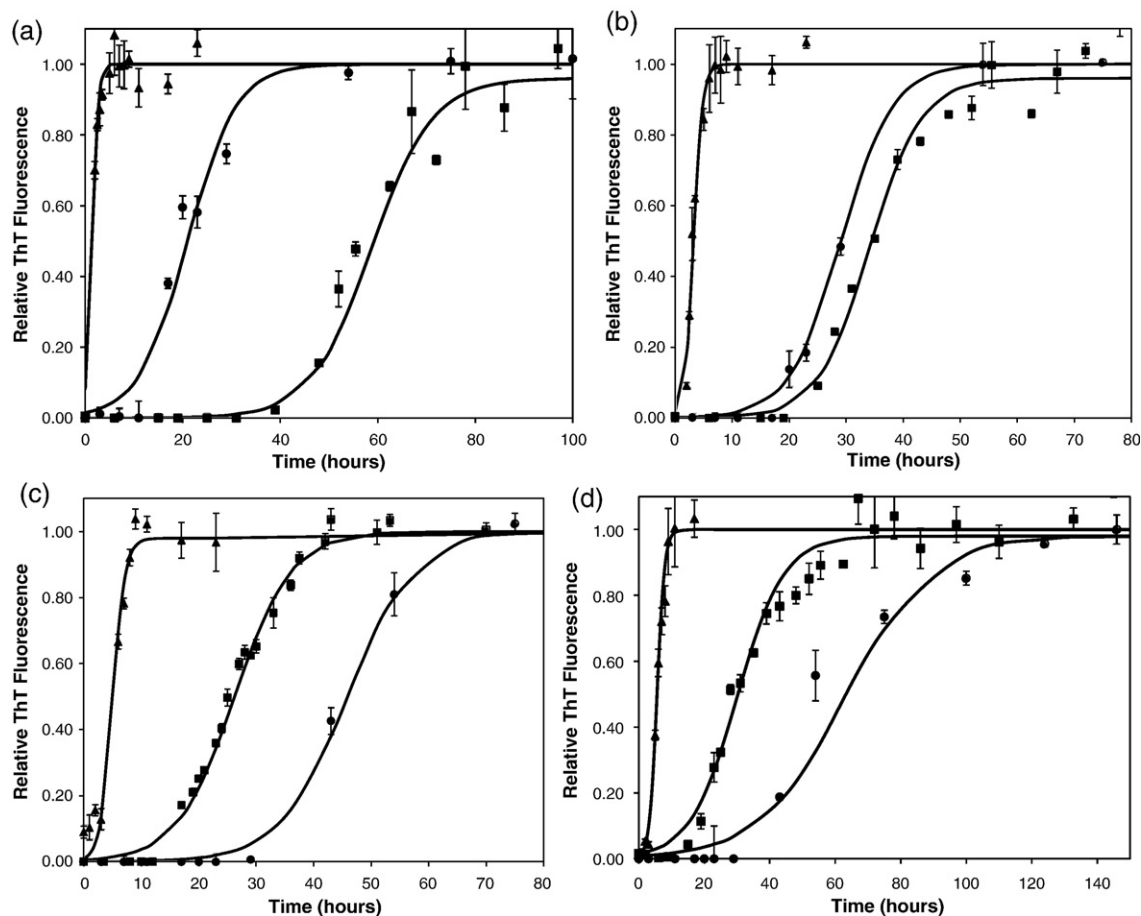


Fig. 5. Polypeptide aggregation in different concentrations of sodium acetate. (a) no salt, (b) 10 mM, (c) 50 mM, and (d) 100 mM. Squares are PEA at pH ~3.6, circles are PE at pH ~4.1, triangles are PE at pH ~3.6. Solid fit lines for a–d are based on a hyperbolic tangent with the center shifted from the origin.



consider different aggregation rates for oligomers using a rate constant approximated from a diffusion-controlled bimolecular association [29], where the collision rate is proportional to  $(D_A + D_B)(r_A + r_B)$  where  $D_i$  and  $r_i$  are the diffusion coefficient and hydrodynamic radius of species  $i$ , respectively. The diffusion coefficient and radius for the secondary species in the reaction may vary and this is not taken into account. However, the primary species is either a monomer, dimer, trimer, etc. For these species, the diffusion coefficient is assumed to scale as  $1/MW^{1/2}$  from the Wilke–Chang correlation [30] where MW is the molecular weight, and the hydrodynamic radius scales as  $N^{0.588}$  [31] where  $N$  is the number of amino acid residues in the polypeptide and is proportional to MW for a given polypeptide. Combining these two effects, the collision frequency will vary as  $MW^{0.088}$ , and, for the variable rate constant model,  $a_{\text{dimer}} = a_{\text{monomer}} * 2^{0.088}$ ,  $a_{\text{trimer}} = a_{\text{monomer}} * 3^{0.088}$ , etc. For either the constant or variable forward rate models, dissociation of species from oligomers can occur with a constant rate constant,  $b$ . For the constant rate model,  $K_s = a/b$ , the same relationship as in the Powers & Powers model, while in the variable rate model,  $K_s$  is defined as  $K_s = a_1/b$ . In order to be able to treat the post-nuclear aggregates together, the dissociation of species from fibrils is neglected.

Using these assumptions, the rate equations for different sized species take the following form:

Monomers:

$$\frac{dX_1}{dt} = -a_1 X_1 \left( 2X_1 + \sum_{j=2}^n X_j + F \right) + b_1 \left( 2X_2 + \sum_{j=3}^n X_j \right). \quad (3)$$

Dimers:

$$\begin{aligned} \frac{dX_2}{dt} = & a_1 X_1 (X_1 - X_2) - b_1 (X_2 - X_3) - a_2 X_2 \left( 2X_2 + \sum_{j=3}^n X_j + F \right) \\ & + b_2 \left( 2X_4 + \sum_{j=5}^n X_j \right). \end{aligned} \quad (4)$$

Oligomers ( $2 < i < n$ ):

$$\begin{aligned} \frac{dX_i}{dt} = & \sum_{j=1}^{i/2(\text{rounddown})} [a_j X_j (X_{i-j} - X_i) - b_j (X_i - X_{i+j})] + \sum_{j=i/2(\text{rounddown})+1}^{n-1} [-a_j X_j X_i + b_j X_{i+j}] \\ & - a_i X_i \left( 2X_i + \sum_{j=i+1}^n X_j + F \right) + b_i \left( 2X_{2i} + \sum_{j=2i+1}^n X_j \right). \end{aligned} \quad (5)$$

Nucleus:

$$\frac{dX_n}{dt} = \sum_{j=1}^{n/2(\text{rounddown})} [a_j X_j (X_{n-j} - X_i) - b_j X_n] - \sum_{j=n/2(\text{rounddown})+1}^{n-1} a_j X_j X_n - a_n X_n (2X_n + F) \quad (6)$$

Fibrils ( $i > n$ ):

$$\frac{dX_i}{dt} = \sum_{j=1}^n a_j X_j (X_{i-j+1} - X_i). \quad (7)$$

Fibril number concentration ( $F$ ):

$$\frac{dF}{dt} = \sum_{j=1}^n \left[ a_j X_j \sum_{k=\frac{n+1}{2}+|j-\frac{n+1}{2}|}^n X_k \right] \quad (8)$$

Fibril mass concentration ( $M$ ):

$$\frac{dM}{dt} = \sum_{j=1}^n \left[ a_j X_j \sum_{k=\frac{n+1}{2}+|j-\frac{n+1}{2}|}^n (j+k) X_k \right] \quad (9)$$

Total mass:

$$M_{\text{tot}} = \sum_{j=1}^n j X_j + M. \quad (10)$$

Note that, in generalizing these equations for oligomeric species, the equations will involve summations with species larger than the nucleus size,  $i > n$ . As these species are not present, these terms were not considered in the mass balance equations.

For each model, kinetic constants were estimated based on the time course of ThT data using a least mean squared error (LMS) optimization. For the random polymerization model, values of the minimum size of the polymer that could be detected ( $m$  values) were varied from 1 to 5000 and corresponding optimal values of the rate constant,  $a$ , were determined. In fitting the analytic solution to the classical nucleated polymerization, the Powers & Powers model, and the modified reaction scheme presented above, the parameter space sampled was initially based on that considered by Powers & Powers. Nucleus sizes ranged from 3 to 9, though this range was expanded for nucleus sizes up to 40 for the classical and Powers & Powers models, and the rate constants,  $a$  and  $b$  (and  $c$  for the Powers & Powers model) were optimized for each nucleus size. For the Powers & Powers model and the model presented here, initial values for  $a$  (or  $a_1$ ) and  $b$  were chosen randomly such that  $a$  was between  $10^1$  and  $10^6$ , which yielded good fits, and  $b$  was initially chosen between  $10^2$  and  $10^8$  smaller than  $a$  (with  $c$  selected randomly at values between  $10^2$  and  $10^5$  times smaller than  $b$  for the Powers & Powers model), but values outside these ranges were considered if they provided better fits. We employed 20 different initial rate constants to determine the global best fit to the data. Initial conditions were chosen based on the molecular weight of the peptide, the peptide concentration, and the maximum fluorescence achieved, such that, at time  $t=0$ , the monomer condition,  $X_1$ , equaled  $X_{\text{total}} = (\text{maximum fluorescence} \times \text{peptide concentration}) / \text{molecular weight} [=] \text{AU} \times \text{mol/L}$ , and all other species concentrations were set to zero. For the model considered here, two different rate conditions were

**Table 1**

Lag time,  $T_{50}$  values, and elongation rates as a function of peptide sequence and concentration, salt composition and concentration, and pH from ThT fluorescence experiments

Peptide	Concn (mg/mL)	pH	Salt	Concn (mM)	Lag time (h)	$t_{1/2}$ (h)	Elongation rate ( $\text{h}^{-1}$ )
PE	1	3.1	NaCOOCH <sub>3</sub>	50	0	0.55	0.81
PE	1	3.6	NaCOOCH <sub>3</sub>	50	1.5	5	0.16
PE	0.5	3.6	NaCOOCH <sub>3</sub>	50	4	7.55	0.14
PE	1	3.6	(NH <sub>4</sub> ) <sub>2</sub> COOCH <sub>3</sub>	50	2.4	5.3	0.17
PE	1	3.6	NaCOOCH <sub>2</sub> CH <sub>3</sub>	50	2.9	5.65	0.12
PE	1	3.6	MgSO <sub>4</sub>	50	2.7	5.62	0.14
PE	1	3.6	NaCOOCH <sub>3</sub>	100	2	5.67	0.05
PE	1	3.6	NaCOOCH <sub>3</sub>	10	1.4	3.9	0.22
PE	1	3.6	NaCOOCH <sub>3</sub>	0	0	1.5	0.26
PE	1	4.1	NaCOOCH <sub>3</sub>	50	25.1	43	0.02
PE	2	4.1	NaCOOCH <sub>3</sub>	50	10.3	18.85	0.05
PE	1	4.1	(NH <sub>4</sub> ) <sub>2</sub> COOCH <sub>3</sub>	50	19.8	34.33	0.03
PE	1	4.1	NaCOOCH <sub>2</sub> CH <sub>3</sub>	50	24	44	0.03
PE	1	4.1	MgSO <sub>4</sub>	50	25	44.2	0.02
PE	1	4.1	NaNO <sub>3</sub>	50	22	35.3	0.03
PE	1	4.1	K <sub>2</sub> HPO <sub>4</sub>	50	16	27	0.03
PE	1	4.1	KNO <sub>3</sub>	50	11.5	26.15	0.04
PE	1	4.1	NaCOOCH <sub>3</sub>	100	37	53.5	0.03
PE	1	4.1	NaCOOCH <sub>3</sub>	10	17	29.75	0.02
PE	1	4.1	NaCOOCH <sub>3</sub>	0	11	19.75	0.04
PEA	1	3.1	NaCOOCH <sub>3</sub>	50	0	1.14	0.20
PEA	1	3.6	NaCOOCH <sub>3</sub>	50	15	27.5	0.03
PEA	2	3.6	NaCOOCH <sub>3</sub>	50	10	16.33	0.07
PEA	1	3.6	(NH <sub>4</sub> ) <sub>2</sub> COOCH <sub>3</sub>	50	12	26.5	0.02
PEA	1	3.6	NaCOOCH <sub>2</sub> CH <sub>3</sub>	50	29.5	35.45	0.08
PEA	1	3.6	NaCOOCH <sub>3</sub>	100	12.5	27.8	0.02
PEA	1	3.6	NaCOOCH <sub>3</sub>	10	22	35.8	0.03
PEA	1	3.6	NaCOOCH <sub>3</sub>	0	38	56.5	0.02

chosen: a “constant rate” model where  $a_1 = a_2 = \dots = a_n$ , and a “variable rate” model where  $a_1 = a_2 * 2^{0.088} = \dots = a_n * n^{0.088}$ .

## 4. Results

### 4.1. CD measurements

CD measurements of diluted polypeptide solutions before aggregation are presented in Fig. 2. Measurements were taken for PE at pH~3.6 and 4.1 and PEA at pH~3.6 in sodium acetate (NaAc) and sodium propionate (NaPr) at 25 °C and after heating at 65 °C for 5 min. Ellipticity curves in NaAc and NaPr are similar. At 25 °C, both PE and PEA exhibit strong double minima at 208 and 222 nm, characteristic of  $\alpha$ -helical structure. For this temperature, PE curves have a similar shape at both pH~3.6 and 4.1, with a deeper minima at 208 nm than 222 nm, though solutions at pH~4.1 have a more negative ellipticity. PEA at this temperature has more symmetric minima at these two minima. Upon heating to 65 °C, PE and PEA solutions at these pH values have a weaker ellipticity, have a flatter slope at 200 nm, and lose their minimum at 222 nm. In addition, spectra for PE at pH~3.6 and 4.1 and PEA at pH~3.6 appeared nearly identical.

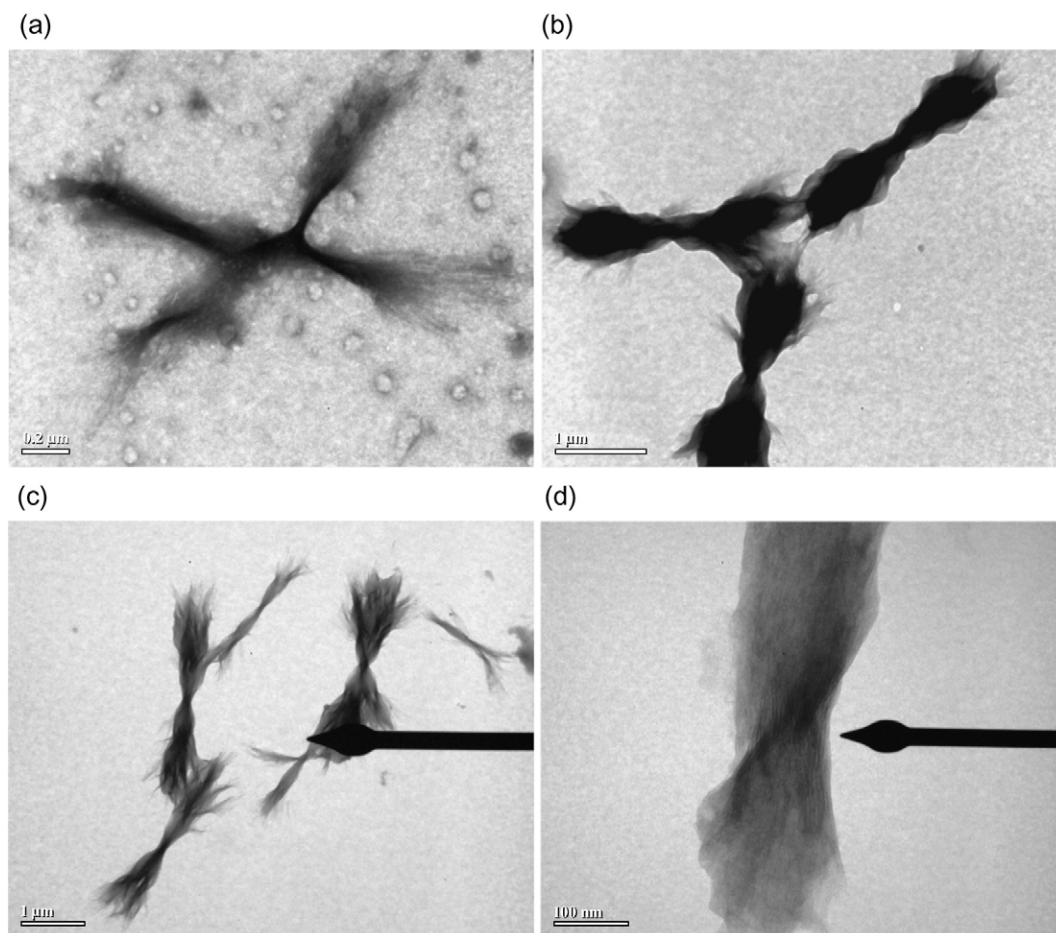
### 4.2. Kinetics of polypeptide aggregation

After heating the solution to 65 °C, ThT fluorescence measurements were taken at different times to track the polypeptide aggregation. Elevated ThT fluorescence usually corresponded with an increased turbidity of the solution, except for the case of PEA aggregates grown at pH~3.6 without salt; these solutions remained

clear throughout the aggregation process yet exhibited strong ThT fluorescence. In terms of magnitude of fluorescence, 1 mg/mL polypeptide in 50 mM salt at pH~3.6 or 4.1 generated a maximum fluorescence of 800–1200. When the pH dropped to 3.1 or the peptide concentration increased to 2 mg/mL, the maximum fluorescence increased to over 2000. Relative fluorescence values for various conditions are presented in Figs. 3–5. No lag phase was observed for either PE or PEA at pH~3.1 as the solutions immediately clouded, and ThT measurements indicated significant binding. For PE between pH~3.1 and 4.6, as pH decreased, peptide concentration increased, or salt concentration decreased, elevated ThT fluorescence occurred at shorter times and reached a plateau more quickly. For PEA at pH~3.6, as peptide or salt concentration increased, the lag phase for aggregation was shorter, and the growth occurred more quickly. No elevated ThT fluorescence was measured for PE at pH~4.6 or for PEA at either pH~4.1 or 4.6. Standard lag times,  $t_{1/2}$  (the time at which the aggregation is 50% complete), and elongation rates for a variety of conditions are presented in Table 1.

### 4.3. Morphology of polypeptide aggregation

The morphology of aggregated PE and PEA species was markedly different. For all conditions, aggregated PE existed in a lamellar morphology, as previously reported [25]. TEM and SEM images of PE aggregates are presented in Figs. 6 and 7, respectively. The widths of these lamellae are difficult to ascertain, as the lamellae twist either individually (as in Fig. 7b) or as groups (as in Fig. 7c). However, the twisted lamellae formed either straight or crossed aggregates 1.5  $\mu$ m to 3.5  $\mu$ m long and 250 nm wide. For the straight lamellae, twists



**Fig. 6.** TEM images of UA-stained PE fibrils in (a) 50 mM sodium nitrate at pH~3.6, (b) 50 mM sodium acetate at pH~3.6, and (c) and (d) 50 mM sodium acetate at pH~4.1. Scale bars are 200 nm, 1  $\mu$ m, 1  $\mu$ m, and 100 nm for (a)–(d), respectively.

occurred every 350 nm to 500 nm down the length of aggregate. For the crossed ones, twists occurred every 150 nm to 200 nm down the length of aggregate. For lamellae twisted in groups, the aggregates had one tight twist in middle, 150 nm to 200 nm thick, and fanned out toward the extremities (as in Fig. 7c).

The morphology of the PEA aggregates depended on the salt concentration. When grown in 10 mM NaAc or no salt at pH ~3.6, PEA aggregates were fibrillar (Figs. 8 and 9). From AFM and TEM images, these fibrils were 4–6 nm wide and 150 nm long for individual aggregates with some bundles of multiple fibrils that are 15–30 nm wide and 3–5  $\mu$ m long. At 50 mM and 100 mM NaAc, PEA aggregates appeared bundled in mostly larger aggregates. While these aggregates appear in TEM images to have both the linear and crossed structures similar to the PE ones, AFM confirms that these are still fibrillar in nature and not lamellar.

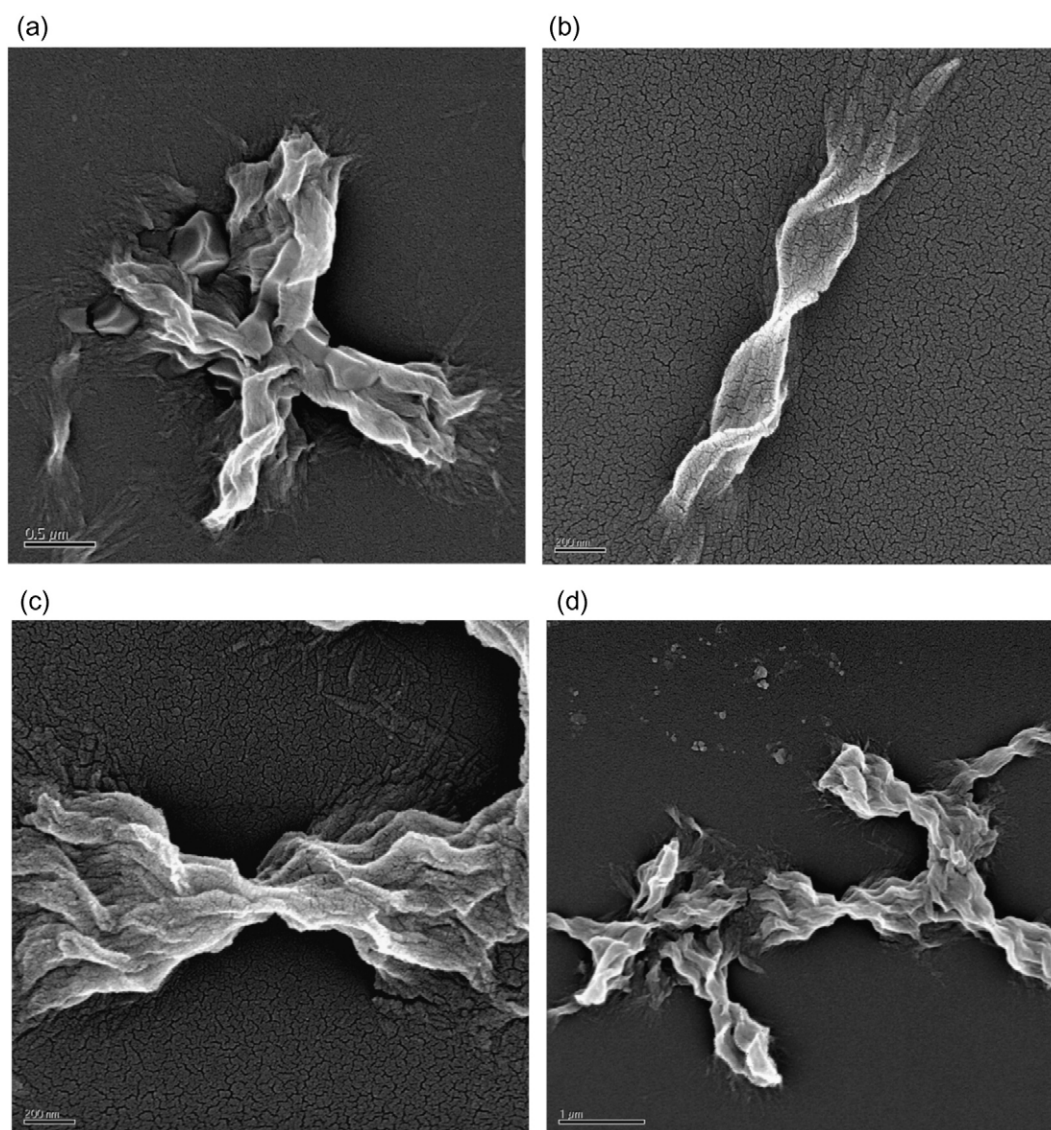
#### 4.4. Simulation of aggregation rates

Comparing experimental rates of fibril formation with the random polymerization model yielded poor agreement. In most cases, the best fits were obtained when  $m=5000$  or higher (data not presented). Simulation of a lag time, which typically appeared present, was only

possible with an unrealistically large minimum detectable aggregate size,  $m$ . Consequently, this model was not able to capture the key features of the polypeptide aggregation.

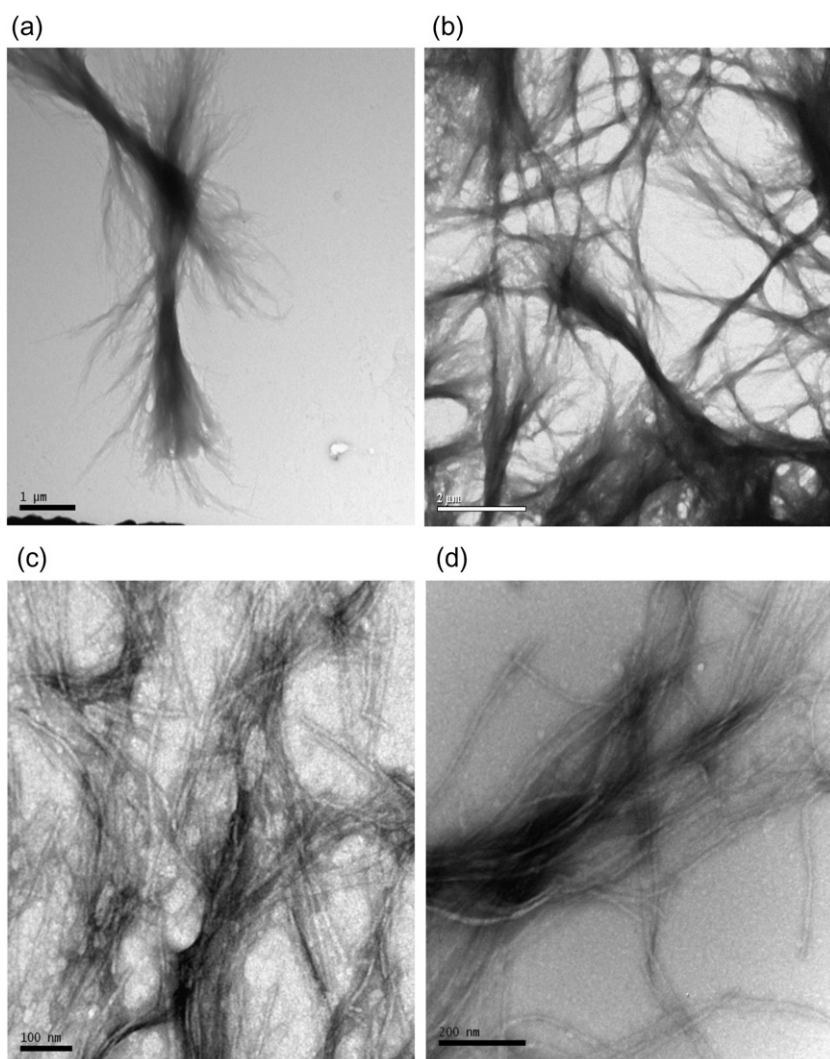
The forward rate constants,  $a$ , and dissociation constants,  $K_s$ , are presented in Fig. 10 as a function of nucleus size for the analytical solution to the classical nucleated polymerization for PE at pH ~4.1 in 50 mM salts. The most striking feature of the classical model is that, for almost all data sets, the best fit occurred with a nucleus size of 3. In considering the nucleus size to be either a monomer or dimer, better fits were obtained with the monomer.

The Powers and Powers model simulations employed a nucleus size ranging from three to nine. For 80% of the data sets, the nucleus size that yielded the best fit over this range was a nine-mer, and thus larger nucleus sizes were considered. The optimal values of the forward rate constant,  $a$ , dissociation constants,  $K_s$  and  $K_c$ , from models with nucleus sizes from  $n=3$  to 40 are presented in Fig. 11 for PE at pH ~4.1 in 50 mM salts. Optimized constants for PE and PEA at pH ~3.6 exhibited similar trends and, thus, are omitted here. In Fig. 11, lines have been added for  $K_s=1$  (representing the point where there is no thermodynamic driving force for aggregation) and  $K_s=X_{tot0}$ , the initial monomer concentration (representing the point where a shift from a nucleated to an irreversible polymerization, or vice versa, is expected

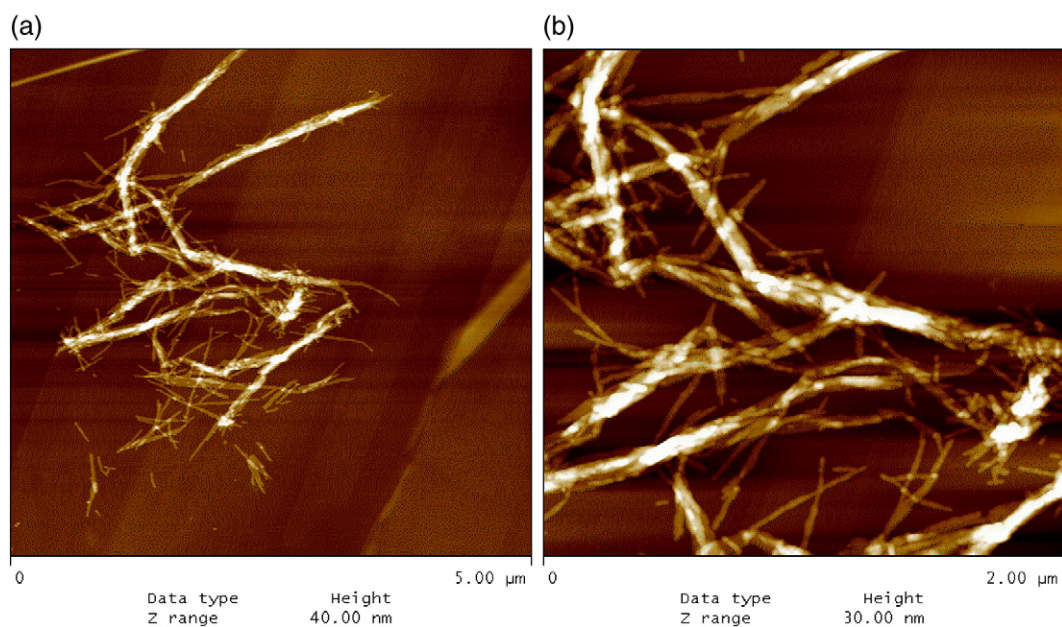


**Fig. 7.** SEM images of Pt-stained PE fibrils in (a) 50 mM potassium nitrate at pH ~4.1, (b) 10 mM sodium acetate at pH ~4.1, (c) and (d) no salt at pH ~3.6. Scale bars are 500 nm, 200 nm, 200 nm, and 1  $\mu$ m for (a)–(d), respectively.

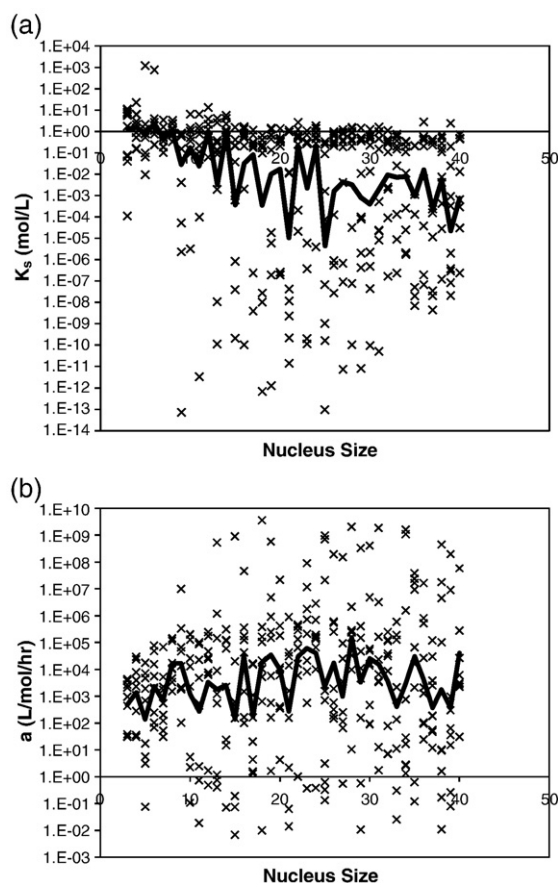




**Fig. 8.** TEM images of UA-stained PEA fibrils at pH ~3.6 in (a) 100 mM, (b) 50 mM, (c) 10 mM, (d) 0 mM sodium acetate. Scale bars are 1  $\mu$ m, 2  $\mu$ m, 100 nm, 200 nm for (a)–(d), respectively.



**Fig. 9.** AFM height images of PEA fibrils grown in 50 mM sodium acetate at pH ~3.6 on HOPG after rinsing with water at pH=7. Scan sizes and height ranges are (a) 5  $\mu$ m and 40 nm and (b) 2  $\mu$ m and 30 nm.



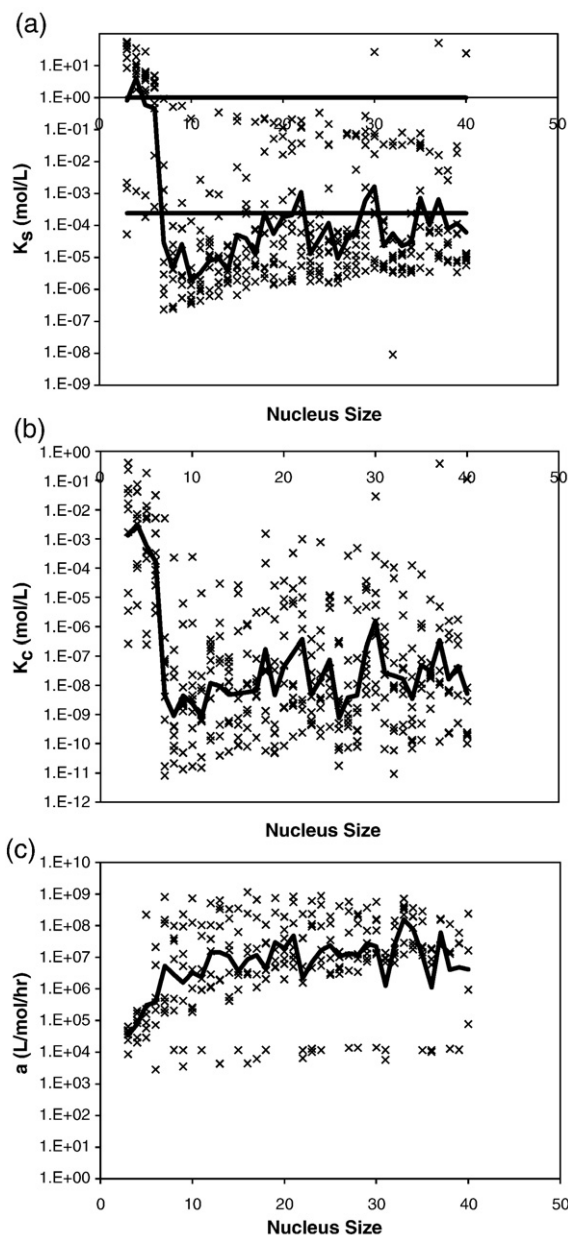
**Fig. 10.** Optimized kinetic parameters, (a)  $K_s$  and (b) forward rate constant,  $a$ , as a function of nucleus size using the analytical solution to the classic nucleated polymerization model for PE at pH ~4.1 in 50 mM salts. Symbols are for different data sets. The black lines are the average values.

to occur). As most of the aggregation experiments were conducted at a polypeptide concentration of 1.0 mg/mL and the molecular weights for our PE and PEA are 4130 g/mol and 19,400 g/mol, respectively,  $X_{\text{tot}0} = 2.42 \times 10^{-4}$  mol/L for PE, and  $X_{\text{tot}0} = 5.15 \times 10^{-5}$  mol/L for PEA. As can be seen from these figures, while average  $\sigma$  (where  $\sigma = K_s/K_c$ ) values remain relatively constant (within an order of magnitude), over all nucleus sizes, average values for both  $K_s$  and  $K_c$  drop several orders once the nucleus size increases beyond 6 or 7 monomers. Typical mean square error values for the Powers & Powers model are comparable to those obtained with the classical nucleated polymerization.

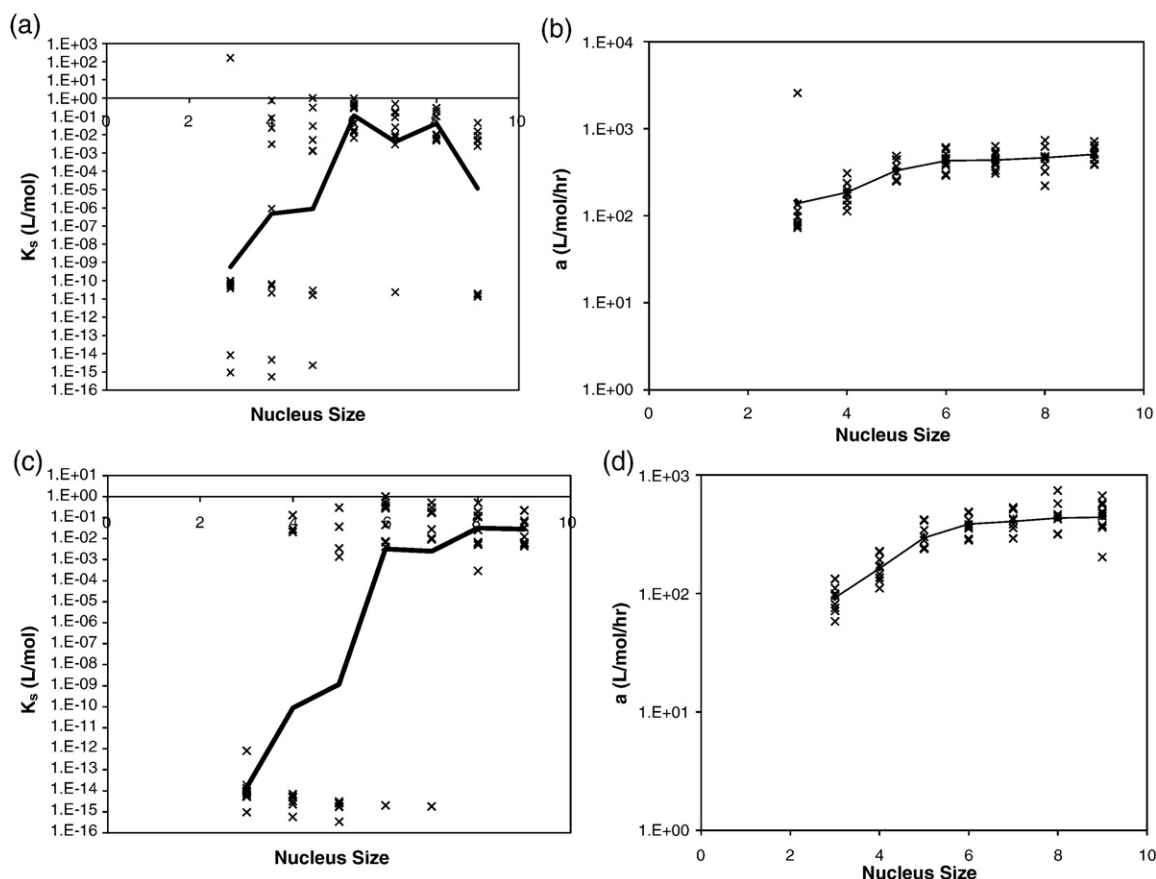
For each solution condition (peptide sequence, pH, and salt concentration), no particular nucleus size consistently was optimal. In order to ascertain whether any particular nucleus size resulted in realistic parameter values, we examined the best fit data for each nucleus size and determined the optimal  $K_s$  value. For a nucleated polymerization mechanism,  $K_c < X_{\text{tot}0} < K_s$  [1]. Thus,  $K_s$  values for polypeptide aggregation at pH ~3.6 and pH ~4.1 should be larger than  $X_{\text{tot}0}$  but less than 1. For PE at both pH ~3.6 and pH ~4.1, a number of different nucleus sizes ( $n$  ranging from 15 to 30) yielded similar results, with many nucleus size having reasonable values in 45–65% of the data sets. However, for PEA at pH ~3.6,  $n=6$  produced optimal parameters in 89% of the data sets, with no other nucleus size giving appropriate  $K_s$  values in more than 45% of the data sets.

Nucleus sizes from three to nine were initially selected in the modified nucleated polymerization model described in Eqs. (3)–(10). For both the constant and molecular weight dependent rate models, the best fits for each data set usually occurred for a similar nucleus size and yielded comparable optimal rate constants. For PE at pH ~3.6, larger nucleus sizes ( $n=8$  or 9) yielded the best fits for the constant

rate model and  $n=9$  for the variable rate model, although for  $n=3$  or 4 the variable model appeared to provide a better fit. For PE at pH ~4.1, a nucleus size of  $n=6$  yielded the best fits for both models, and depended on the nature of the salt. For PEA at pH ~3.6, larger nucleus sizes ( $n=7, 8$  or 9) yielded the best fits for the constant rate model and  $n=9$  for the variable rate one. No particular nucleus size yielded the best fits for over 50% of the data for either model. Best fit forward rate constants,  $a$ , and dissociation constant,  $K_s$ , from modeling over nucleus sizes from  $n=3$  to 9 with the both models are presented in Fig. 12 for PE at pH ~4.1 in 50 mM salts. Best fit constants for PE and PEA at pH ~3.6 exhibited similar trends and are omitted here. The forward rate constant,  $a$ , increased by a factor of three to five as the nucleus size was increased from three to nine. The best fit reverse rate constants and the dissociation constants fell into two ranges, with  $K_s$  values either on the order of  $10^{-15}$  or  $10^{-16}$  mol/L or  $10^{-1}$  to  $10^{-3}$  mol/L. The smaller values often occurred at the smaller nucleus sizes of  $n=3$ ,



**Fig. 11.** Optimized kinetic parameters as a function of nucleus size using the Powers model for PE at pH ~4.1 in 50 mM salts of (a)  $K_s$ , (b)  $K_c$ , and (c) forward rate constant,  $a$ . Symbols are for different data sets. The black lines are the average values. For  $K_s$ , the semi-transparent lines are for  $K_s=1$  and  $K_s=X_{\text{tot}0}$ .



**Fig. 12.** Optimized kinetic parameters as a function of nucleus size using the modified nucleated polymerization model for PE at pH ~4.1 in 50 mM salts. The top row presents (a)  $K_c$  and (b) forward rate constant,  $a$ , for the constant rate model, and the bottom row presents (c)  $K_c$  and (d) forward rate constant,  $a$ , for the variable rate model. Symbols are for different data sets. The black lines are the average values.

4, or 5, though the larger values were more common over all nucleus sizes.

A comparison of the best fit rate constants for the classical nucleated polymerization, the Powers Model, and our model is presented in Table 2 for PE at pH ~3.6 and 4.1 and PEA at pH ~3.6 in 50 mM salts. In addition, in comparing the average best fits of the models to the data, both the constant rate model and variable rate models yielded about 56% and 77% better fits, respectively, than the Powers Model for nucleus sizes  $n=3$  to 9. When expanding the Powers model to larger nucleus sizes (from  $n=3$  to 40), the modified models still yielded 29% and 43% better fits, respectively.

## 5. Discussion

### 5.1. Experimental results

Except for data obtained at pH ~3.1 and 4.6, the shape of fibril concentration as a function of time was sigmoidal, with a lag phase, a steep growth phase, and a plateau. At pH ~3.1, no lag phase was

evident for PE or PEA in 50 mM NaAc. At pH ~4.6, no aggregation occurred for either polypeptide in 50 mM NaAc. When the pH was raised to 4.6 or above, the aggregates dissociated, as evidenced by both ThT fluorescence signals and TEM images (data not shown). Sigmoidal kinetics are typically characteristic of a nucleated polymerization mechanism, which was confirmed by seeding a PE solution at pH ~4.1 with preformed aggregates, which significantly reduced the lag phase. The growth kinetics depended on polypeptide composition, pH, and salt concentration and, to a lesser degree, salt composition. For both PE and PEA in 50 mM salt, as the pH decreased from 4.6 to 3.1, the polypeptide solutions initially showed no detectable aggregation, either through ThT measurements or through visible precipitate. As the pH was lowered, aggregation occurred after a lag phase, and around pH 3.1 aggregation occurred immediately. The point at which the transitions occurred depended on the primary polypeptide composition. At pH ~4.1, PEA does not noticeably aggregate, yet PE does. At pH ~3.6, PEA aggregates after a considerable lag phase, but PE's lag phase is shortened in comparison to that at pH ~4.1. Since the larger polypeptide would be expected to aggregate faster than the

**Table 2**  
Average optimized model parameters using the classical nucleated polymerization, Powers & Powers, and modified nucleated polymerization models over the specified nucleus size for polypeptides in 50 mM salts for PE at pH ~3.6 and 4.1 and PEA at pH ~3.6

Model	PE in 50 mM salts at pH ~3.6			PE in 50 mM salts at pH ~4.1			PEA in 50 mM salts at pH ~3.6		
	$a$ (L/mol/h)	$K_s$ (mol/L)	$K_c$ (mol/L)	$a$ (L/mol/h)	$K_s$ (mol/L)	$K_c$ (mol/L)	$a$ (L/mol/h)	$K_s$ (mol/L)	$K_c$ (mol/L)
Classic nucleated polymerization ( $n=3$ to 40)	2.26E+04	5.17E-03	–	3.02E+03	1.48E-02	–	1.09E+05	1.78E-04	–
Powers & Powers model ( $n=3$ to 40)	4.90E+05	6.08E-02	3.91E-05	2.98E+05	1.38E-02	6.63E-06	4.24E+06	4.46E-03	1.76E-06
Powers & Powers model ( $n=3$ to 9)	6.81E+06	2.84E-03	1.23E-06	1.40E+07	1.35E-04	5.20E-08	6.56E+07	9.26E-05	2.37E-08
Modified NP Model ( $n=3$ to 9, constant $a$ )	2.03E+03	1.91E-05	–	3.43E+02	5.93E-02	–	3.47E+03	1.49E-04	–
Modified NP Model ( $n=3$ to 9, variable $a$ )	1.94E+03	1.38E-05	–	2.00E+02	5.44E-04	–	3.67E+03	1.86E-05	–



smaller one, a difference in collision rates cannot explain the different aggregation rates for PE and PEA at pH~3.6 nor for PE at pH~3.6 versus 4.1. The polypeptide monomer conformation does not provide an explanation of the difference in aggregation rates either. While there is a significant change in the CD spectra of the polypeptides when the temperature is increased from 25 °C to 65 °C, with a decrease in  $\alpha$ -helical character, the ellipticities of PE at pH~3.6 and 4.1 and PEA at pH~3.6 at 65 °C are almost identical. Thus, there appears to be little difference in the monomer conformation between these two polypeptides at this elevated temperature or as a function of pH. With little change in conformation and collision rates, the different aggregation rates may depend on electrostatic interactions.

Based on the size of the polypeptides studied here, the calculated isoelectric points of PE and PEA are 2.61 and 2.27, respectively [32]. Thus, at a given pH, PEA will have a larger negative charge per peptide bond than PE. Previous work by Fandrich and Dobson has shown that in order to form amyloid fibrils of polypeptides with hydrophilic residues, the pH must be adjusted toward the isoelectric point of the peptide [22]. As amyloid fibrils are characterized by extensive  $\beta$ -sheet structure, decreasing the net charge on the polymer minimizes repulsive side chain interactions and permits stable stacking of these sheets. Thus, a more negatively charged peptide or protein would be expected to form an ordered aggregate with  $\beta$ -sheet structure more slowly. Table 3 shows the total amount of charge on a monomer of PE and PEA as a function of pH for our polypeptides in the absence of salt. For polypeptide aggregation in the absence of salt, PE at pH~3.6 exhibited no lag phase. A lag phase and growth phase region were present for PE at pH~4.1 and PEA at pH~3.6, and no aggregation occurred for PE at pH~4.6 or PEA at either pH~4.1 or 4.6. Fig. 5a shows ThT fluorescence measurements in the absence of salt, and indicate that when the total charge on the monomer is less than 3 to 6, an irreversible polymerization can occur. Above a charge of 9 to 13, no aggregation occurs. In between these values, the lag phase is shorter and the aggregation proceeds more quickly with fewer charges on an individual species.

The situation is more complex when examining the effect of salt on aggregation. As salt concentration increases, the charge on a polypeptide will be screened. PEA at pH~3.6 exhibited a shorter lag phase and slightly faster growth with increasing salt concentration. This has been previously observed with  $\alpha$ -synuclein fibrillization at salt concentrations above 10 mM [17]. However, while the rate of  $\alpha$ -synuclein aggregation increased up to salt concentrations of 1 M, the rates of PEA aggregation in 50 mM and 100 mM NaAc were identical. Addition of salt caused the opposite effect for PE at pH~3.6 and 4.1; increasing salt concentration led to slower rates of aggregation. The reason for this salt effect for PE has not been determined.

Using PE at pH~4.1, the importance of kosmotropic and chaotropic cations and anions on both the kinetics of polypeptide aggregation and on the morphology of the aggregates was examined. While no morphological difference was apparent for either PE or PEA aggregates grown in different salts, the kinetics did change with the nature of the salt. In particular, the cation seemed to control aggregation rates. Chaotropic potassium salts led to significantly decreased lag phases over slightly kosmotropic sodium salts, though the growth rates were similar. Whether the anion was a kosmotrope or a chaotrope had little effect on the kinetics with potassium. However, for kosmotropic cations, chaotropic anions led to a shorter lag phase than kosmotropic anions. Thus, we see that the main specific salting effect is with salts

that weakly order the water around the polypeptide leading to shorter lag phases.

## 5.2. Comparison of kinetic models

While we have experimentally determined the importance of electrostatics in polypeptide aggregation, we used simulations to further examine the energetics and kinetics of aggregation. Models based on classical nucleated polymerization, the model of Powers & Powers, and the model developed here provide a basis for comparison. Fitting the ThT data with the classical model, a nucleus size of 1 often yielded the best fit. A nucleus size of 1 indicates that the monomer would be the highest energy species, indicating the absence of a lag phase and irreversible polymerization. Examining best-fit rate constants for the classical model, in many cases,  $K_s > 1$ . With  $K_s > 1$ , a small nucleus size yielded the best fit, and the addition of a monomer to any species during the polymerization is energetically unfavorable. However, since only the monomeric species exists at time  $t=0$ , there is a kinetic driving force from the monomer to larger species. Since monomer addition to fibrils is irreversible, once the monomers are incorporated into the post-nuclear aggregates, they are kinetically trapped. This situation does not seem physically reasonable, and, thus, we chose to analyze our data with other models that incorporate more realistic assumptions.

Optimal parameters for the Powers & Powers model are reported in Fig. 10. Values of  $K_s$  and  $K_c$  decrease by several orders of magnitude as the nucleus size increased from 3 to 6 or 7. For  $n=3$  or 4, best fit  $K_s$  values greater than unity were observed in several data sets. The origin of these larger  $K_s$  values for smaller nucleus sizes is apparent when examining the magnitude of the rate constants. Forward rate constants for PE and PEA are on the order of  $10^6$  or  $10^7$  L/mol/h. With polypeptide concentrations of  $10^{-4}$  or  $10^{-5}$  mol/L, in the absence of oligomer and fibril dissociation, aggregation would be predicted to take place in minutes, instead of the hours or days observed for most of the experimental solutions. To counterbalance this rapid aggregation, one of two conditions must occur. Either the nucleus size must be large enough to allow for a lag phase before nucleation occurs, or there must be an almost equally large dissociation from oligomers to slow the aggregation process. With small nucleus sizes, dissociation constants must be large to slow this aggregation process, leading to unreasonably large  $K_s$  values. As the modeled nucleus size becomes large, the dissociation constants decrease to more realistic values. For  $n$  larger than 6 or 7, different nucleus sizes yield indistinguishable kinetic parameters with the Powers & Powers model. For this reason, their model cannot distinguish between larger nucleus sizes for the data presented here.

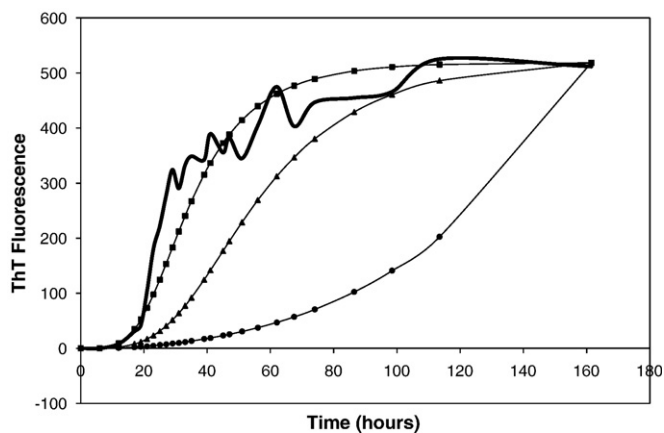
While no single nucleus size yielded the best fit to the experimental data with the Powers & Powers model, we examined the effect of salt on aggregation with this model. As the concentration increased, our experiments showed that aggregation occurred more rapidly. If the structural nucleus size does not change, either the forward rate constant,  $a$ , or  $K_s$  should increase, tending toward the total polypeptide concentration,  $X_{\text{total}}$ , where a transition to an irreversible polymerization would occur with increasing concentration. Neither the forward rate constant nor  $K_s$  increase with the addition of more salt. Can this rate change then be attributed to a structural shift in the nucleus size with salt? If we examine the best fit constants obtained with PEA, we see that larger nucleus sizes fit the data better, ranging from  $n=9$  for 100 mM salt to  $n=39$  for no salt. However, for these salt concentrations, the best fit yield  $K_s$  values are of order  $10^{-6}$ , which is smaller than the total polypeptide concentration and would indicate the presence of irreversible polymerization.

Due to the inability to fit the PE data and determine whether there is a change in the nucleus size or in the energetics of species interactions, we developed a model similar to the Powers model but allowing for oligomer interactions. With both the constant and the

**Table 3**  
Negative charges on a polypeptide monomer as a function of pH

Peptide	pH			
	3.1	3.6	4.1	4.6
PE	0.72	2.44	6.52	13.60
PEA	2.88	8.84	23.44	48.81





**Fig. 13.** A comparison of the Powers & Powers model to both the constant and variable modified nucleated polymerization (NP) models with the same kinetic parameters. For this comparison, a nucleus size of 8 was assumed,  $a=3.49e2$ ,  $b=3.05$ , and  $c=0$ . The raw data is for PE grown in 50 mM potassium nitrate at pH ~ 4.1. The thick black line is the ThT fluorescence data, the squares are for the variable rate modified NP model, the triangles are for the constant rate NP model, and the circles are for the Powers & Powers model.

variable models, this model is able to fit the data significantly better than the Powers and Powers model and with only two fitting parameters ( $a$  and  $b$ ) versus three for the Powers model ( $a$ ,  $b$ , and  $c$ ). This model also yielded forward rate constants two to three orders of magnitude smaller than the Powers model and one order of magnitude smaller than the classical nucleated polymerization model, as seen for PE and PEA in 50 mM salts in Table 2. With oligomeric interactions creating more pathways to form fibrils, rapid aggregation will occur with smaller forward rate constants. Fig. 13 shows a comparison of our model and the Powers and Powers model at the same values of  $a$  and  $b$  and illustrates quite clearly that this model yields faster fibril growth than the Powers and Powers model. Even for small nucleus sizes, the reverse reaction rate is not large, and  $K_s$  values are rarely greater than one for either the constant or variable rate models. However, best fit reverse rate constants assumed either large or small values. For smaller nucleus sizes, this model allows for high rates of aggregate growth without large forward reaction rates, i.e., the reverse rate constant can be small and still provide a good fit to the data.

Another promising feature of the model presented here is that for either the constant or variable rate model, the expected trend of  $K_s$  values for aggregation in 50 mM salts holds, in contrast to the Powers and Powers model. In 50 mM salts, the aggregation rate and lag phase are quickest for PE at pH ~ 3.6 and slowest for PE at pH ~ 4.1, with PEA at pH ~ 3.6 falling in the middle. Average  $K_s$  values for a variety of nucleus sizes would be expected to be smallest for PE at pH ~ 3.6 and largest for PE at pH ~ 4.1. As we can see in Table 2, this trend holds for our models, not for the classical nucleated polymerization or the Powers and Powers model.

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