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5	Tunable Protein Crystal Size Distribution via Continuous
6	Slug-Flow Crystallization with Spatially Varying Temperature
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Abstract

22 Accompanied with the growth of the biopharmaceuticals market has been an interest in developing processes with increased control of product quality attributes at low manufacturing 23 cost, with one of the approaches being through genuinely continuous manufacturing processes. 24 Part of this interest is in new drug product formulations that extend shelf-life and improve the 25 patient experience. Some of these drug product formulations require the production of protein 26 27 crystals of controlled size distribution. This article describes a continuous tubular crystallizer in which the size distribution of the produced protein crystals is tuned by controlling the spatial 28 temperature along the tube. Under the proper buffer and pH condition, the magnitude and 29 30 dispersion of product protein crystals are reproducibly manipulated using a fully controlled temperature profile over a 25- to 30-minute residence time, and the formation of amorphous 31 precipitates can be achieved under higher supersaturation condition via the addition of 32 33 concentrated precipitant for drug products in which higher solubility is desired. The tunable continuous process for protein crystallization has the potential to become a low-cost platform 34 35 technology for producing protein crystals for a variety of biologic drug product formulations.

36 Keywords

37 Continuous manufacturing; pharmaceutical crystallization; continuous crystallization;
38 population balance modeling; tubular crystallization; slug-flow crystallization

1. Introduction

40 From an industrial perspective, an opportunity exists to develop scalable non-chromatographic protein separations methods that disrupt the traditional batch-wise paradigm and support 41 continuous purification modes¹⁻³. Despite efforts to demonstrate the future viability of sequential 42 'bind-and-elute' chromatography, resin-based adsorption processes are costly and widely 43 perceived within the biomanufacturing field to be a major process bottleneck^{1,4-6}. Technologies 44 45 such as periodic counter-current chromatography (PCC), simulated moving bed chromatography (SMB), and multi-column counter-current solvent gradient purification (MCSGP) have been 46 demonstrated to reduce this bottleneck⁷. Each of these processes, however, employs more 47 48 columns, valves, and pumps than sequential chromatography, substantially increasing both system complexity and capital equipment costs^{2,8,9}. Further, given that they require the same number of 49 stages as sequential chromatography to achieve the same purification efficiency – but operate at 50 51 higher throughputs using more resin – PCC, SMB, and MCSGP have operating expenses (OPEX) costs that scale linearly with respect to conventional techniques. In contrast, non-chromatographic 52 protein purification methods such as precipitation, aqueous two-phase extraction (ATPE), and 53 crystallization are relatively simple to execute, require a small initial capital investment, and boast 54 OPEX costs (primarily buffers/solvents) that scale sub-linearly with throughput^{2,6,7}. A single 55 56 example of the application of each of these three techniques to continuous protein purification has been published¹⁰⁻¹². In addition to reducing facility footprints, precipitation, ATPE, and 57 crystallization have the potential to dramatically increase equipment utilization, allowing the 58 biopharmaceutical sector to realize higher productivities and improved operational flexibility^{2,3,7}. 59 These methods could also support the robust control of short product residence times, allowing for 60

61 the rapid recovery of labile protein and standardization of critical quality attributes across each 62 lot^{3,7}. Finally, the improved purification efficiency gleaned by coupling these techniques with 63 'clean' expression hosts (*e.g.*, *Komagataella phaffii*), as well as their amenability to scale-out by 64 parallelization^{13,14}.

65 Despite its potential cost-effectiveness and scalability, however, the intrinsic difficulty of optimizing and controlling protein crystallization has prevented its broad adoption as a preparative 66 purification technique^{7,15}. Specifically, a generalized set of heuristics governing the myriad 67 physical, chemical, and biochemical factors that can impact protein crystal nucleation and growth 68 has yet to be realized¹⁵⁻¹⁷. Consequently, while a wide range of proteins has been crystallized at 69 the μL scale for structure determination using various combinatorial screening approaches (e.g., 70 71 hanging and sitting drop vapor diffusion, free interface diffusion, and dialysis), recombinant insulins are the only biopharmaceutical reported to be purified by crystallization at the industrial 72 scale^{7,18}. Studies surrounding the batch crystallization of enzymes (e.g. hen egg white lysozyme 73 (HEWL), lipase) and monoclonal antibody fragments from both homo- and heterogeneous 74 mixtures at volumes ranging from 100 mL to 1 L represent promising demonstrations of this 75 technique as a method for 'at-scale' purification, but fall short of proving industrial applicability¹⁵. 76 77 In addition, protein crystallization from nearly pure solution is suitable for producing crystals in drug product formulation/delivery¹⁹. Amorphous lyophilizates and aqueous solutions are 78 79 commonly used for formulation/delivery but have low stability and high viscosity at high concentration. Crystals have a higher stability and could lead to a better patient experience with 80 consistent controlled properties. For injection, which is currently the primary mode of 81 82 administration, high viscosity requires a large-bore needle and a high amount of force to push the

83 needle into the body, which is painful for the patient. Experimental results for monoclonal 84 antibodies have demonstrated that injection of a crystalline suspension reduces the syringe force 85 by about 50% for the same protein concentration compared to liquid formulation¹⁵. The injection 86 of crystals also enables the protein to be taken into the blood stream at a slower rate for a more 87 sustained release. In all of these protein crystal-based drug product formulations, the rate of uptake 88 of the biotherapeutic protein molecules into the bloodstream depends critically on the size 89 distribution of the protein crystals.

90 A recent set of experiments has demonstrated tubular designs as viable technologies for protein crystallization^{12,20}. Using a low-cost setup designed around disposable plastic components and 91 syringe pumps, crystallization of HEWL was reported from a purified solution at a rate of 0.72 92 g/h. Such studies have not demonstrated robust feedback process control. In this article, we 93 leverage optimization/control theory - building off from prior art surrounding the tubular 94 crystallization of small molecules and active pharmaceutical ingredients - and develop a flexible 95 flow-through system for the continuous crystallization of therapeutically relevant proteins under 96 feedback control. 97

Here, a fully automated system designed to operate under segmented slug-flow and capable of on-line control of the cooling process is applied to the continuous crystallization of the model protein HEWL. In addition to temperature, pH and buffered precipitant solution are used to control the supersaturation of HEWL at various defined points along the length of the crystallizer. These parameters are carefully combined to permit tuning the particle size distribution (PSD) generated by the counter current heat exchanger (CCHEX) platform under controlled and seeded inlet conditions. The system is further demonstrated that this control is possible over a residence time 105 as short as 25–30 minutes (2x–4x shorter than similar recent reports). Powder X-Ray Diffraction 106 (PXRD) and cross-polarized transmitted light microscopy are used to qualitatively score the 107 relative ratio of amorphous-to-crystalline HEWL generated under each set of conditions tested. 108 The images acquired using cross-polarized light is analyzed using the custom crystal image 109 analysis algorithm designed for adjusting contrast and segmenting overlaid crystal image.

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111 **2. Experimental method**

112 **2.1.** Materials

Hen egg white lysozyme (HEWL) was used as the model protein for all experiments as described. Buffer preparation involved sodium acetate (NaOAc), hydrochloric acid (HCl), HPLCgrade distilled deionized water, and disposable 0.2 μm vacuum filtration systems. A 1 M solution of sodium hydroxide (NaOH) was used to flush the CCHEX crystallizer at the beginning and end of each day of experiments.

Seed solutions for all experiments were prepared by first suspending HEWL in a refrigerated solution of 2% w/v sodium chloride (NaCl) and 100 mM NaOAc (pH 4.0) to a concentration of 70 g/L. The suspension was then placed in a water batch held at 30°C and stirred for 3.5 hours. The resulting hazy solution was subsequently vacuum filtered, placed back in the water bath, and allowed to cool spontaneously overnight. Before first use, the seed solution was heated to the appropriate temperature as indicated in Table 1.

124 **2.2.** Experimental apparatus

125 The experimental apparatus in Fig. 1 consists of peristaltic pumps, heat exchangers (HEX), heating and cooling baths, and controlled-temperature water baths^{21,22}. All but one of the 126 components are integrated in a computer used for collecting data and performing real-time control 127 128 calculations. The precipitant pump containing NaCl aqueous solution was not integrated into the 129 larger control system, as the in-line precipitant mixing was manually set at the beginning of the 130 experiment and was not changed during each experiment. The precipitant solution was stored in a 131 magnetically stirred, jacketed, 1 L, glass, two-necked round-bottom flask plumbed in series with 132 the cold coolant reservoir and seed/feedstock solution Allihn condenser.

133 The temperature-controlled HEWL solution enters the crystallizer from the round-bottom flask 134 at the left in Fig. 1 and traverses a short segment of insulated tubing before transiting through the preliminary heat exchanger (pre-HEX) and mixing with a slipstream of concentrated, chilled, and 135 buffered NaCl. The mixture of HEWL and precipitant then traverse under an indirect 136 ultrasonication probe and mixes with filtered air to form stable liquid slugs. Slug flow is 137 hydrodynamically stable for a very large range of gas and liquid flow rates for the tubing diameter 138 and fluid properties in the experiments in this study, as observed experimentally in consistency 139 with theoretical expressions as detailed in a recent book chapter²³. The slugs then move through 140 HEXs 1, 2, and 3 prior to be collected for imaging and PXRD analysis at the outlet. For all 141 142 experiments that did not employ concentrated precipitant addition, the air and liquid flow rates into the slugging tee were both 7 mL/min. The air and liquid flow rates into the slugging tee during 143 144 experiments that involved concentrated precipitant addition were 7 and 9.61 mL/min (HEWL 145 solution 7 mL/min and precipitant solution 2.61 mL/min), respectively. For each HEX, the shellside flowrate from the peristaltic pumps is given by the proportional-integral (PI) controllers toachieve the set point temperature.



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Figure 1. A process flow diagram of the continuous crystallizer with in-line precipitant mixing capabilities,
where HEWL is hen egg white lysozyme, HEX refers to a heat exchanger, and TT refers to a temperature
transmitter.

152 **2.3. Design of experiments**

153 Each of the four sets of experimental conditions tested was designed to expose HEWL transiting the continuous system to markedly different supersaturation conditions while holding 154 constant the residence time of the slugs (Table 1). All temperature and the concentration of 155 156 precipitant set points were determined with the aid of empirical models fitted to solubility data²⁴. 157 Specifically, Experiment 1 was designed to 'crash cool' the HEWL solution immediately upon entering the pre-HEX module by exposure to a maximum instantaneous supersaturation (σ_{max}) 158 where $\sigma = C/C_{sat} - 1$, C is the HEWL concentration, and C_{sat} is the solubility) equal to ~18. 159 Experiment 2 is designed to reduce σ_{max} to ~6.4 and promote dissolution in HEX 1 following 160 161 primary nucleation in the pre-HEX. Experiment 3 was designed to expose slugs of dissolved and crystalline HEWL to a shallow temperature - and by extension, supersaturation - gradient with 162

163	σ_{max} of ~4.3 in an effort to favor the growth of seed crystals relative to the nucleation of new
164	particles. Finally, Experiment 4 representsed a situation in which σ_{max} was varied aggressively
165	(~220) by using a combination of concentrated precipitant (<i>i.e.</i> , NaCl) addition and crash cooling.
166	Each of Experiments 1-3 was performed in duplicate. This study explores a wide range of
167	supersaturations to demonstrate the ability of the system to access a very large experimental design
168	space, and to assess the effects on the product crystals. Further, relative to Experiments 1-3,
169	Experiment 4 was designed to exploit the generalized phase behavior of protein solutions, which
170	predicts that extreme values of σ_{max} will preferentially induce the formation of amorphous
171	precipitates over well-ordered crystals ²⁵ . In this way, disordered aggregates of HEWL are
172	generated intentionally as a control to aid in distinguishing crystalline from non-crystalline
173	samples by both cross-polarized microscopy and PXRD.

174Table 1. HEWL experimental parameters and set points. T = temperature. Rep. = replicate. Precipitant was17515% w/v NaCl, 57.7 mM NaOAc, pH 4.0 buffer held at 3.0° C.

Euro	Rep.	Seed Bath	Temperatures (°C)				
Exp.		Temperature (°C)	Pre-HEX	HEX 1	HEX 2	HEX 3	
1	1	32.6	5	5	5	23	
1	2	32.35	5	5	5	23	
2	1	28.65	14	20	11	7	
2	2	28.45	14	20	11	7	
3	1	23.8	17	15	11	8	
3	2	23.9	17	15	11	8	
4	1	42	5	5	5	5	

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177 **2.4.** Automated imaging analysis for particle size distribution

For each experiment, a single pulse of HEWL (Table 1) was fed into the continuous crystallizer. Pulses of air (each 10 s long) bracketed the HEWL to aid in identifying crystalcontaining slugs at the outlet. All slugs of HEWL were collected as they exited the crystallizer in a single sterile 50 mL conical tube. Four 45 μ L droplets of the collected slurry were immediately 182 transferred to an air-dusted microscope slide and protected from evaporation with cover glasses. 183 A set of position matched images of each droplet was then acquired using a microscope fitted with 184 a digital camera, a 10X trinocular eyetube, and 4X/0.10 HI PLAN objective. The resolution of this 185 optical setup was $1 \mu m$ /pixel. Light intensity, aperture, and condenser settings were kept constant 186 across all images and all experiments.



188 Figure 2. Graphical summary of the image processing algorithm which is a modified version of marker-189 controlled watershed segmentation for sorting out overlaid crystals.

Each of the four cross-polarized micrographs corresponding to a given experiment was analyzed using the watershed algorithm with markers and boundaries described in Fig. 2. First of all, the original color image is mapped to grayscale for adjusting the contrast. The adjusted image is dilated with structuring element neighborhood where pixels are connected along the horizontal or vertical direction for protecting tiny size crystals from eroding process. The boundaries of segmented objects are calculated in pixels and separate the threshold of regions for the watershed method. The foreground markers in the object are obtained by a closing followed by erosion and are superimposed on grayscale image with the boundaries of regions. The magnitudes of markers are modified to regional minima of the objective region and scaled to different integer values. The flooding process is performed from the marker (the regional minima), and the borderline is constructed between the extended regions of different labeled markers. Finally, the area and length of crystals are estimated and used to acquire the particle size distribution.

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2.5. Powder x-ray diffraction

Approximately 10 minutes after collection (the time required to perform all imaging described in section 2.3), the remaining slurry from a given experiment was divided into 12 to 15 1.0-mL aliquots and centrifuged at 10,000 g and 22°C for 2 minutes. The resulting supernatant was subsequently aspirated off and discarded. A second identical centrifugation step was employed in the case when bulk liquid remained after aspiration. Pellets were then stored under ambient conditions for ~4 hours prior to analysis by PXRD. The obtained crystals were crushed using a mortar and pestle in order to maximize the number of visible crystal faces²⁶.

PXRD was performed using a PANalytical X'Pert PRO diffractometer. The instrument was configured as described in a past study²⁶ and operated at a tension of 45 kV and an anode current of 40 mA. All scans were conducted under the following programmable settings to maximize resolution at low angles: $3.507^{\circ}-13.5^{\circ} 2^{\theta}$ range; 0.0167113° step; 455.295 s step time; $0.004661^{\circ/s}$ scan speed; and 1 rps spinner stage rotation speed. Each scan analyzed the equivalent of at least 8 pellets pressed onto a zero-background sample tray. A blank sample tray diffractogram was acquired under these same settings. A negative control diffractogram of the 2% w/v NaCl and 100 mM NaOAc (pH 4.0) buffer used to prepare all HEWL solutions were obtained using the same instrument and hardware configuration noted above. 75 mL of the buffer was first boiled on a hot plate under stirring for 2 hours to evaporate most of the bulk liquid. The remaining slurry was then dried in a vacuum oven overnight to yield a powder of crystalline NaCl and NaOAc in a mass ratio identical to that in the original buffer.

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4 **3. Results and Discussion**

3.1. Protein crystal populations

226 Microscope images were acquired for each experiment using cross-polarized light (Fig. 3). Particles of HEWL that appear white are birefringent and are very likely crystalline²⁷. Particles 227 that appear dark are amorphous precipitates of HEWL or crystals possessing a cubic (*i.e.*, isotropic) 228 229 lattice instead of the desired tetragonal structure. The inlet seed and outlet particles for 230 Experiments 1 to 3 are overwhelming anisotropic crystals (Fig. 3). Experiment 4, which is at 231 extremely high supersaturation σ_{max} , yielded minimal anisotropic crystals (Fig. 4). The production of different solid states during particle formation operating under different magnitude 232 supersaturation is commonly observed for small molecule²⁸, and can certainly occur for protein 233 molecules which have many more degrees of freedom. 234



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Figure 3. Representative micrographs from HEWL DoE Experiments 1–3. The upper image in each set is representative of the seed PSD used in the associated experiment. The lower image in each set is representative of the outlet PSD generated by the associated experiment. All images were acquired under cross-polarized lighting conditions using identical microscope aperture, condenser, and magnification (40X) settings. The scale bars are 250 μ m in all images. (a.1) Seed of Experiment 1. (a.2) Outlet of Experiment 1. (b.1) Seed of Experiment 2. (b.2) Outlet of Experiment 2. (c.1) Seed of Experiment 3. (c.2) Outlet of Experiment 3.



243 244 Figure 4. Representative micrographs from Experiment 4. The left image in each set was acquired under

245 cross-polarized lighting conditions, while the right image was captured using plane polarized light. The

246 crystal sample as not repositioned between image acquisitions. Identical microscope aperture, condenser,

247 and magnification (40X) settings were used for all four images. The scale bars are 250 µm in all images.

248 (a) Seed. (b) Outlet.



Figure 5. Measured particle size distribution (upper) and cumulative distribution function (lower) of seed (blue) and product (orange) crystals. (a.1) and (a.2), (b.1) and (b.2), and (c.1) and (c.2) are for Experiments 1, 2, and 3 (summation of replicates), respectively. For all images, the horizontal axes are crystal length (μ m). The vertical axes are different for the seed and product crystals. As stated in Section 2.3, only particles that exhibited high-intensity constructive interference under cross-polarized light (Fig. 3) were considered crystals to calculate these PSDs.

257 With the image analysis procedure described in Section 2.3, micrographs of Experiments 1, 2, and 3 were used to measure the PSDs of the seed and generated crystals in Fig. 5 (Experiment 4 258 was excluded from the analysis since the particles have a different solid state and so would have 259 260 different solubility and crystallization kinetics). The crystallization conditions in Experiments 1 261 and 2 yielded markedly different final PSDs than for Experiment 3. The leftward shift of the experimental cumulative distribution functions (ECDFs) for Experiments 1 and 2 from relatively 262 heavy-tailed seed populations to substantially more monodisperse final distributions of small 263 crystals (L < 30 μ m) suggests that, at an initial $\sigma_{max} \ge 5$, nucleation of HEWL crystals was strongly 264 favored over the growth of existing particles. In contrast, the product PSD is much more similar 265

266 to the seed PSD in Experiment 3, with a similar level of broadness. The resulting PSDs are 267 consistent with the temperatures used in the experiments (Table 1). The temperature in Experiment 1 was dropped to its lowest value at the crystallizer inlet and kept the value low, which would 268 269 promote nucleation, until increasing the temperature at the end to promote growth. The large 270 number of nuclei generated upstream in Experiment 1 would limit the size in which the crystals can grow downstream. The temperature in Experiment 2 also dropped to a low value at the 271 crystallizer inlet, then was raised which would result in dissolution, and then the temperature was 272 dropped to a very low value, and then kept low until the outlet. The large number of nuclei 273 generated upstream would then largely be dissolved in the dissolution part of the crystallizer, but 274 275 then a burst of nuclei would be generated again, which would then grow. The temperature in Experiment 3 was monotonically decreased by small reductions (Table 1), which resulted in much 276 less nuclei formulation. Taken collectively, Fig. 5 demonstrates that, even over residence times as 277 278 short as 25-30 minutes, the continuous protein crystallization system can be used to tune the characteristics of the protein crystal populations. 279

Table 2. Summary statistics for seed and product populations used in Experiments 1–3. N_T is the total number of crystals, $\overline{L}_{1,0}$, $\overline{L}_{2,0}$, and $\overline{L}_{3,0}$ are the mean crystal length (µm), surface area (µm²), and volume (µm³) in given experiments (summation of replicates), respectively. All mean size statistics were calculated using moments of the analytical derivatives of the ECDFs reported in Fig. 5. All N_T values were determined directly from the PSDs reported in these same figures.

Moment	Experiment 1		Experiment 2		Experiment 3	
Moment	Seed	Product	Seed	Product	Seed	Product
N _T	6.7×10^{3}	2.1×10^{5}	7.6×10^{3}	5.8×10^{5}	1.2×10^{4}	1.7×10^{4}
$\overline{L}_{1,0}$	5.7	5.0	5.4	3.3	6.8	4.9
$\overline{L}_{2,0}$	1.3×10^{2}	5.5×10^{1}	1.3×10^{2}	1.9×10^1	1.6×10^{2}	9.3×10^{1}
$\mathcal{L}_{3,0}$	5.7×10^{3}	1.1×10^{3}	5.4×10^{3}	3.1×10^{2}	7.4×10^{3}	3.9×10^{3}

285 Continuously differentiable analytical expressions for these ECDFs were fitted using 286 piecewise cubic Hermite interpolating polynomials and used to calculate the summary statistics in 287 Table 2 via

$$f(L) = \frac{n(L)}{N_T},\tag{1}$$

$$\bar{L}_{p,0} = \int_{0}^{\infty} L^{p} f(L) dL, p = 1, 2, \dots$$
⁽²⁾

288 where f(L) is the number normalized PSD and $\overline{L}_{p,0}$ are weighted mean crystal sizes²⁹.

The above observations from Fig. 5 are seen in the summary statistics in Table 2. Given that all PSDs were acquired from consistent total volumes of well-mixed slurries, the fact that $\frac{N_{T,product}}{N_{T,seed}} > 10$ for Experiments 1 and 2 and ~1 for Experiment 3 indicates that Experiments 1 and

292 2 produced a much larger number of small crystals than Experiment 3. Further, for Experiments 1 293 and 2, nucleation was so strongly favored the process resulted in a drastic decrease in the mean 294 crystal volume $L_{3,0}$ (< 0.2x) between the inlet and outlet of the system.

3.2. Structural characterization of HEWL

PXRD was employed as an orthogonal method to assess the qualitative crystallinity of all samples generated and confirm the results of cross-polarized microscopy. Fig. 6 plots low angle diffractograms for each of Experiments 1–4 from top to bottom. Where appropriate, diffractograms for replicate experiments are plotted on common axes. Additionally, an idealized powder diffractogram (bottom panel; purple line) for tetragonal HEWL served as a reference. All samples collected at the outlet of the crystallizer during Experiments 1–3 exhibit relatively defined diffraction peaks that match reference peak positions to within $\pm 0.5^{\circ} 2\theta$, suggesting that a

substantial fraction of the particles formed in each run was crystalline tetragonal HEWL. This 303 small offset in 2^{θ} can likely be attributed to the higher resolution and signal-to-noise ratio of single-304 crystal to powder XRD³⁰. Differences in the number of structure-bound water molecules between 305 samples could also convolute the traces. The systematic translation in 2θ evident between each 306 307 pair of traces for Experiments 1–3 is the result of small (0(mm)) differences in the positioning of 308 each sample within the focusing circle of the diffractometer³¹. While the PXRD data unequivocally 309 corroborate the formation of crystals in Experiments 1-3, all six diffractograms exhibit a broad 310 parabolic baseline ('halo') that indicates the presence of some amorphous or short-range ordered nanocrystalline phases of matter³². Although techniques for estimating the relative ratio of 311 amorphous to crystalline material in PXRD traces exist (e.g., the Rietveld method), they are 312 313 generally regarded as being difficult to implement and subject to large uncertainties³³. A comparison of the top three panels of Fig. 6 to the black trace (Exp. 4; confirmed amorphous 314 precipitate) in the bottom panel of the figure, however, bolsters the claim that Experiments 1-3315 yielded HEWL particles exhibiting significant crystalline character. HEWL analyzed as received 316 from the manufacturer also produced a purely amorphous diffractogram (Fig. 6; bottom panel; 317 gray line), which confirms the ability of the end-to-end seed population preparation and 318 crystallization process to generate long-range ordered protein particles from otherwise disordered 319 320 precursor materials.



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Figure 6. Powder X-ray diffraction traces characterizing the crystallinity of samples generated during the experiments. Plots 1–3 (top to bottom) are the PXRD traces gathered for material generated in Experiments 1–3, respectively. The 4th plot shows reference non-crystalline spectra for manufacturer-supplied HEWL, and HEWL intentionally precipitated out of solution using the CCHEX platform (black; Exp. 4). The purple trace in the bottommost plot is an idealized PXRD diffractogram calculated using publicly available singlecrystal XRD data banked in the RCSB Protein Data Bank (ID: 3wun). The vertical red lines in each plot correspond to the positions of a subset of the critical peaks in the idealized PXRD trace. The intensity of the lines is arbitrary.

Lastly, negative control diffractograms for a blank sample tray and vacuum-dried HEWL dissolution buffer are presented in Fig. 7. The diffractogram for the blank sample tray exhibits a flat baseline for $2\theta \ge 3^\circ$. Similarly, the HEWL dissolution buffer diffractogram exhibits only a single peak within the range $9.5^\circ \le 2\theta \le 10^\circ$, which is characteristic of NaOAc. These controls 334 indicate that neither the dissolution buffer nor the sample tray are expected to obscure the PXRD



335 peaks of HEWL under the measurement conditions employed³⁴.



Figure 7. Control PXRD diffractograms of HEWL dissolution buffer (a) and zero-background sample tray (b). The vertical red lines in each panel correspond to a subset of the critical peak positions in an idealized diffractogram calculated from single-crystal XRD data for tetragonal HEWL (PDBid: 3wun). (a) The doublet at ~ 27.5° 2θ are characteristic of NaCl. The low intensity peak at ~ 9° 2θ is characteristic of NaOAc (and is subject to shift above $10^{\circ} 2\theta$ due to variations in molecular hydration). (b) The high-intensity baseline below $3^{\circ} 2\theta$ is likely the result of direct beam scattering off of the sample tray itself at these extremely shallow angles.

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345 **4.** Conclusion

A continuous slug-flow crystallizer comprising reconfigurable, feedback-controlled, counter current heat exchangers is applicable to mediating protein crystallization. Experiments using hen

egg white lysozyme as the model protein showed that particle size distributions could be 348 349 reproducibly manipulated using temperature gradients alone over a residence time of only 25-30 minutes. The formation of XRD-crystalline particles of HEWL was robust to maximum relative 350 supersaturation gradients spanning two orders of magnitude, with σ_{max} values ≥ 5 favoring the 351 352 nucleation over the growth of existing crystals. In addition, the in-line mixing of concentrated precipitant solution allowed σ_{max} values as large as 220 to be achieved in concert with steep 353 temperature gradients. Powder x-ray diffraction indicated that σ_{max} of this magnitude 354 overwhelmingly favored the formation of amorphous precipitates, which would have lower 355 stability and higher solubility than crystals. The low cost and disposable nature of the slug-flow 356 continuous crystallizer (~\$100 for the disposable tubing) and the ability to tune the particle size 357 distribution suggest that this crystallization platform could be suitable in applications where the 358 protein therapeutic is delivered in crystalline form, since the PSD directly affects the rate in which 359 360 the protein would be absorbed by the body.

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Conflict of Interest

362 There are no conflicts to declare.

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References

- 370 1. Gagnon, P., Technology trends in antibody purification. *Journal of Chromatography A* 371 **2012**, *1221*, 57-70.
- 372 2. Jungbauer, A., Continuous downstream processing of biopharmaceuticals. *Trends in* 373 *Biotechnology* **2013**, *31* (8), 479-492.
- 374 3. Konstantinov, K. B.; Cooney, C. L., White paper on continuous bioprocessing May 20–21
- 375 2014 continuous manufacturing symposium. *Journal of Pharmaceutical Sciences* **2015**, *104* (3), 376 813-820.
- Kelley, B., Very large scale monoclonal antibody purification: The case for conventional
 unit operations. *Biotechnology Progress* 2008, *23* (5), 995-1008.
- 379 5. Kelley, B., Industrialization of mAb production technology: The bioprocessing industry at 380 a crossroads. *mAbs* **2009**, *1* (5), 443-452.
- 381 6. Hong, M. S.; Severson, K. A.; Jiang, M.; Lu, A. E.; Love, J. C.; Braatz, R. D., Challenges 382 and opportunities in biopharmaceutical manufacturing control. *Computers & Chemical*
- 383 Engineering **2018**, 110, 106-114.
- Zydney, A. L., Continuous downstream processing for high value biological products: A
 Review. *Biotechnology and Bioengineering* 2015, *113* (3), 465-475.
- Bryntesson, M.; Hall, M.; Lacki, K. Chromatography method. U.S. Patent 7,901,581, Mar
 8, 2011.
- 388 9. Warikoo, V.; Godawat, R.; Brower, K.; Jain, S.; Cummings, D.; Simons, E.; Johnson, T.;
- 389 Walther, J.; Yu, M.; Wright, B.; McLarty, J.; Karey, K. P.; Hwang, C.; Zhou, W.; Riske, F.;
- 390 Konstantinov, K., Integrated continuous production of recombinant therapeutic proteins. 391 *Biotechnology and Bioengineering* **2012**, *109* (12), 3018-3029.
- 392 10. Eggersgluess, J.; Wellsandt, T.; Strube, J., Integration of aqueous two-phase extraction 393 into downstream processing. *Chemical Engineering & Technology* **2014**, *37* (10), 1686-1696.
- 394 11. Hammerschmidt, N.; Tscheliessnig, A.; Sommer, R.; Helk, B.; Jungbauer, A., Economics 395 of recombinant antibody production processes at various scales: Industry-standard compared to
- 396 continuous precipitation. *Biotechnology Journal* **2014**, *9* (6), 766-775.
- 397 12. Neugebauer, P.; Khinast, J. G., Continuous crystallization of proteins in a tubular plug-398 flow crystallizer. *Crystal Growth & Design* **2015**, *15* (3), 1089-1095.
- 399 13. Crowell, L. E.; Lu, A. E.; Love, K. R.; Stockdale, A.; Timmick, S. M.; Wu, D.; Wang, Y.;
- 400 Doherty, W.; Bonnyman, A.; Vecchiarello, N.; Goodwine, C.; Bradbury, L.; Brady, J. R.; Clark,
- 401 J. J.; Colant, N. A.; Cvetkovic, A.; Dalvie, N. C.; Liu, D.; Liu, Y.; Mascarenhas, C. A.; Matthews,
- 402 C. B.; Mozdzierz, N. J.; Shah, K. A.; Wu, S.-L.; Hancock, W. S.; Braatz, R. D.; Cramer, S. M.; 403 Love, J. C., On-demand manufacturing of clinical-quality biopharmaceuticals. *Nature*
- 404 Biotechnology 2018, 36 (10), 988-995.
- 405 14. Lu, A. E.; Paulson, J. A.; Mozdzierz, N. J.; Stockdale, A.; Versypt, A. N. F.; Love, K. R.;
- 406 Love, J. C.; Braatz, R. D., Control systems technology in the advanced manufacturing of biologic
- 407 drugs. In Proc. of the IEEE Conference on Control Applications, 2015; pp. 1505-1515.
- 408 15. Hekmat, D., Large-scale crystallization of proteins for purification and formulation. 409 *Bioprocess and Biosystems Engineering* **2015**, *38* (7), 1209-1231.
- 410 16. McPherson, A., Introduction to protein crystallization. *Methods* **2004**, *34* (3), 254-265.

- 411 17. Russo Krauss, I.; Merlino, A.; Vergara, A.; Sica, F., An overview of biological 412 macromolecule crystallization. *International Journal of Molecular Sciences* **2013**, *14* (6), 11643-413 11691.
- 414 18. Baker, J. C.; Roberts, B. M. Preparation of stable insulin analog crystals. U.S. Patent 415 5,597,893, Jan 28, 1997.
- 416 19. Mitragotri, S.; Burke, P. A.; Langer, R., Overcoming the challenges in administering
- 417 biopharmaceuticals: formulation and delivery strategies. Nature Reviews Drug Discovery 2014,
- 418 *13* (9), 655-672.
- 419 20. Zhang, D.; Xu, S.; Du, S.; Wang, J.; Gong, J., Progress of pharmaceutical continuous 420 crystallization. *Engineering* **2017**, *3* (3), 354-364.
- 421 21. Mozdzierz, N. J. Developing scalable and modular technologies for continuous
 422 biopharmaceutical production. Ph.D. thesis. Massachusetts Institute of Technology, Cambridge,
 423 MA, 2018.
- 424 22. Mozdzierz, N. J.; Lee, Y.; Hong, M. S.; Benisch, M. H. P.; Rasche, M. L.; Tropp, U. E.;
- 425 Jiang, M.; Myerson, A. S.; Braatz, R. D., Mathematical modeling and experimental validation of
- 426 continuous slug-flow tubular crystallization with ultrasonication-induced nucleation and spatially
- 427 varying temperature. *Chemical Engineering Research and Design* **2021**, *169*, 275-287.
- 428 23. Pirkle, J. C.; Rasche, M. L.; Braatz, R. D.; Jiang, M., CHAPTER 5 Slug-flow continuous 429 crystallization: Fundamentals and process intensification. In *The Handbook of Continuous* 430 *Crystallization*, The Royal Society of Chemistry: Croydon, UK, 2020; pp. 219-247.
- 431 24. Forsythe, E. L.; Judge, R. A.; Pusey, M. L., Tetragonal chicken egg white lysozyme 432 solubility in sodium chloride solutions. *Journal of Chemical & Engineering Data* **1999**, *44* (3), 433 637-640.
- 434 25. Chayen, N. E., Methods for separating nucleation and growth in protein crystallisation. 435 *Progress in Biophysics and Molecular Biology* **2005**, *88* (3), 329-337.
- 436 26. Pons Siepermann, C. A.; Huang, S.; Myerson, A. S., Nucleation inhibition of benzoic acid 437 through solution complexation. *Crystal Growth & Design* **2017**, *17* (5), 2646-2653.
- 438 27. Dombrowski, R. T., 1 Microscopy techniques for analyzing the phase nature and 439 morphology of biomaterials. In *Characterization of Biomaterials*, Jaffe, M.; Hammond, W.; 440 Tolias, P.; Arinzeh, T., Eds. Woodhead Publishing: Waltham, MA, 2013; pp. 1-33.
- 441 28. Myerson, A., *Handbook of Industrial Crystallization*. Butterworth-Heinemann: Woburn, 442 MA, 2002.
- 443 29. Ranodolph, A., *Theory of Particulate Processes: Analysis and Techniques of Continuous* 444 *Crystallization*. Elsevier: New York, 2012.
- 445 30. Varlashkin, P., Approaches to quantification of amorphous content in crystalline drug 446 substance by powder X-ray diffraction. *American Pharmaceutical Review* **2011**, *14* (1), 22-28.
- 447 31. Speakman, S., Basics of X-Ray Powder Diffraction: Training to Become an Independent
- 448 User of the X-Ray SEF at the Center for Materials Science and Engineering at MIT. Online][Cited:
 449 April 6, 2017.] http://prism.mit.edu/xray/oldsite/Basics%20of%20X-Ray%20Powder%
 450 20Diffraction. pdf.
- 451 32. Bates, S.; Zografi, G.; Engers, D.; Morris, K.; Crowley, K.; Newman, A., Analysis of
- 452 amorphous and nanocrystalline solids from their X-ray diffraction patterns. *Pharmaceutical*
- 453 *Research* **2006**, *23* (10), 2333-2349.

454 33. Kemethmüller, S.; Roosen, A.; Goetz-Neunhoeffer, F.; Neubauer, J., Quantitative analysis 455 of crystalline and amorphous phases in glass–ceramic composites like LTCC by the Rietveld 456 method. *Journal of the American Ceramic Society* **2006**, *89* (8), 2632-2637.

457 34. Kumar, R.; Vyas, S.; Kumar, R.; Dixit, A., Development of sodium acetate trihydrate-

458 ethylene glycol composite phase change materials with enhanced thermophysical properties for

459 thermal comfort and therapeutic applications. Scientific Reports 2017, 7 (1), 1-11.

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