

# Continuous Manufacturing Platform for Lipid and Polymer-based Nanoparticle Therapeutics

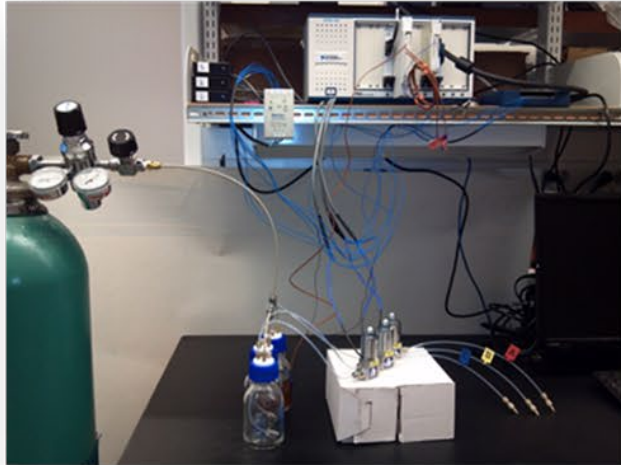
**Presenter: Antonio Costa, Ph.D.**  
Diane Burgess, Ph.D.

Affiliation: University of Connecticut, Storrs, CT

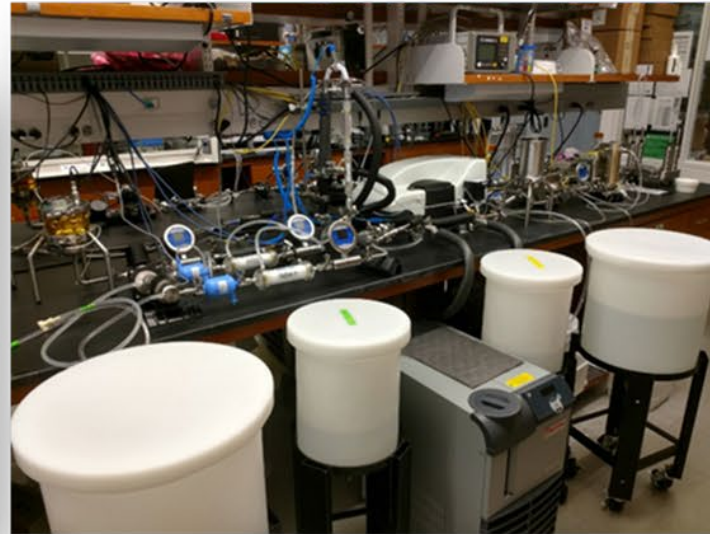
10/11/2023

# From laboratory to industrial technology

2014



2018



2022

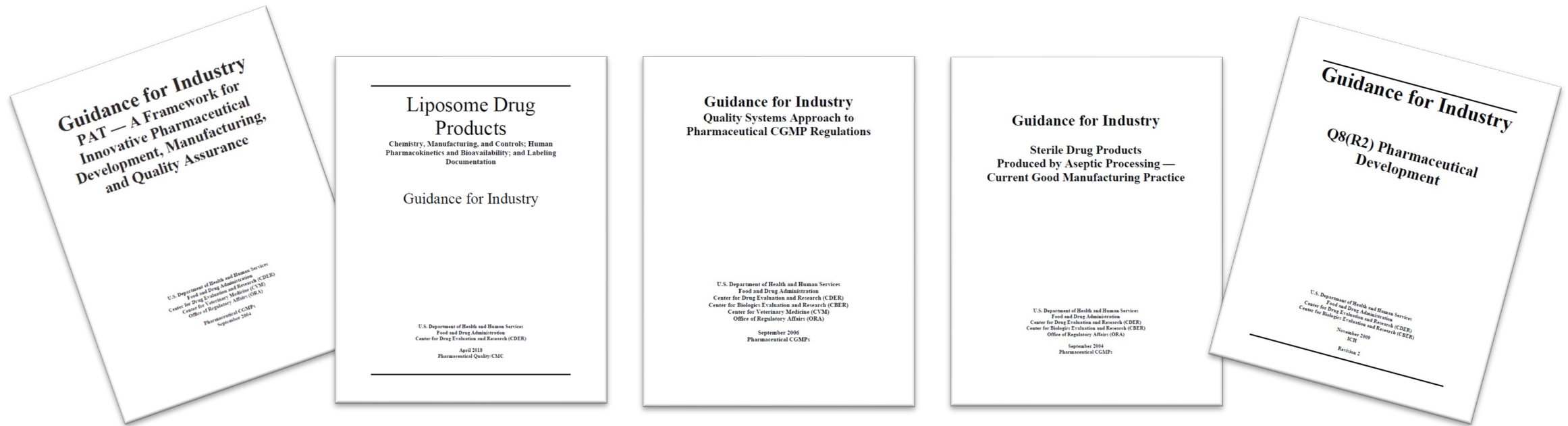




# Modernizing Pharma Manufacturing

“One of today’s most important tools for modernizing the pharmaceutical industry is a process known as continuous manufacturing...”

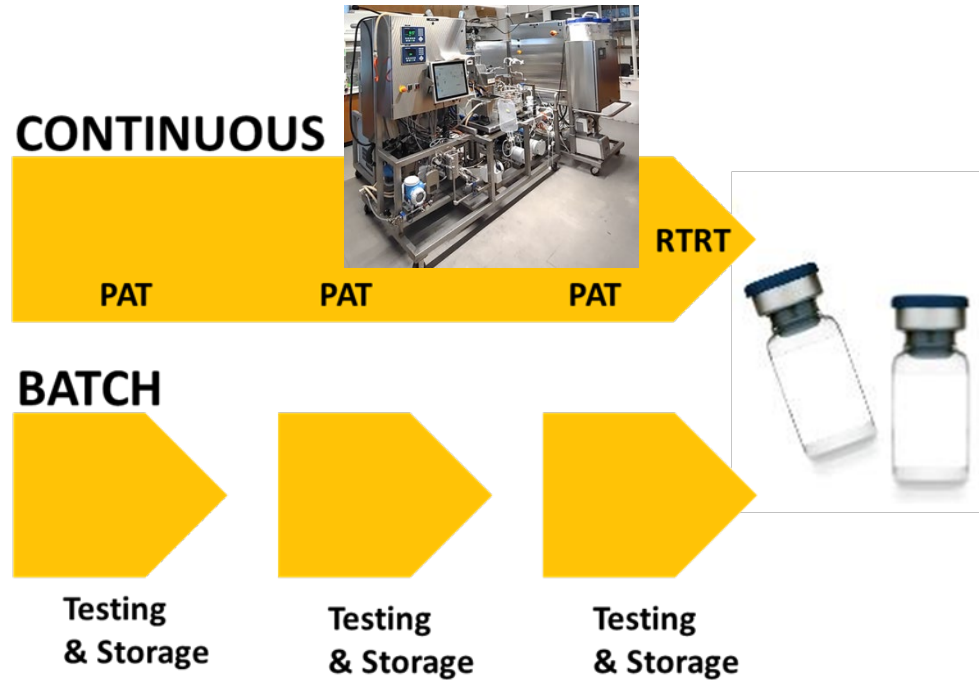
~Joint Statement by former FDA Commissioner Scott Gottlieb and FDA Director Janet Woodcock, 2019



“Allows FDA to issue grants to study continuous manufacturing — a technologically advanced and automated manufacturing method.”

~The 21<sup>st</sup> Century Cures Act, 2019

# Batch vs. Continuous



*“...quality cannot be tested into products; it should be built-in or should **be** by design”*

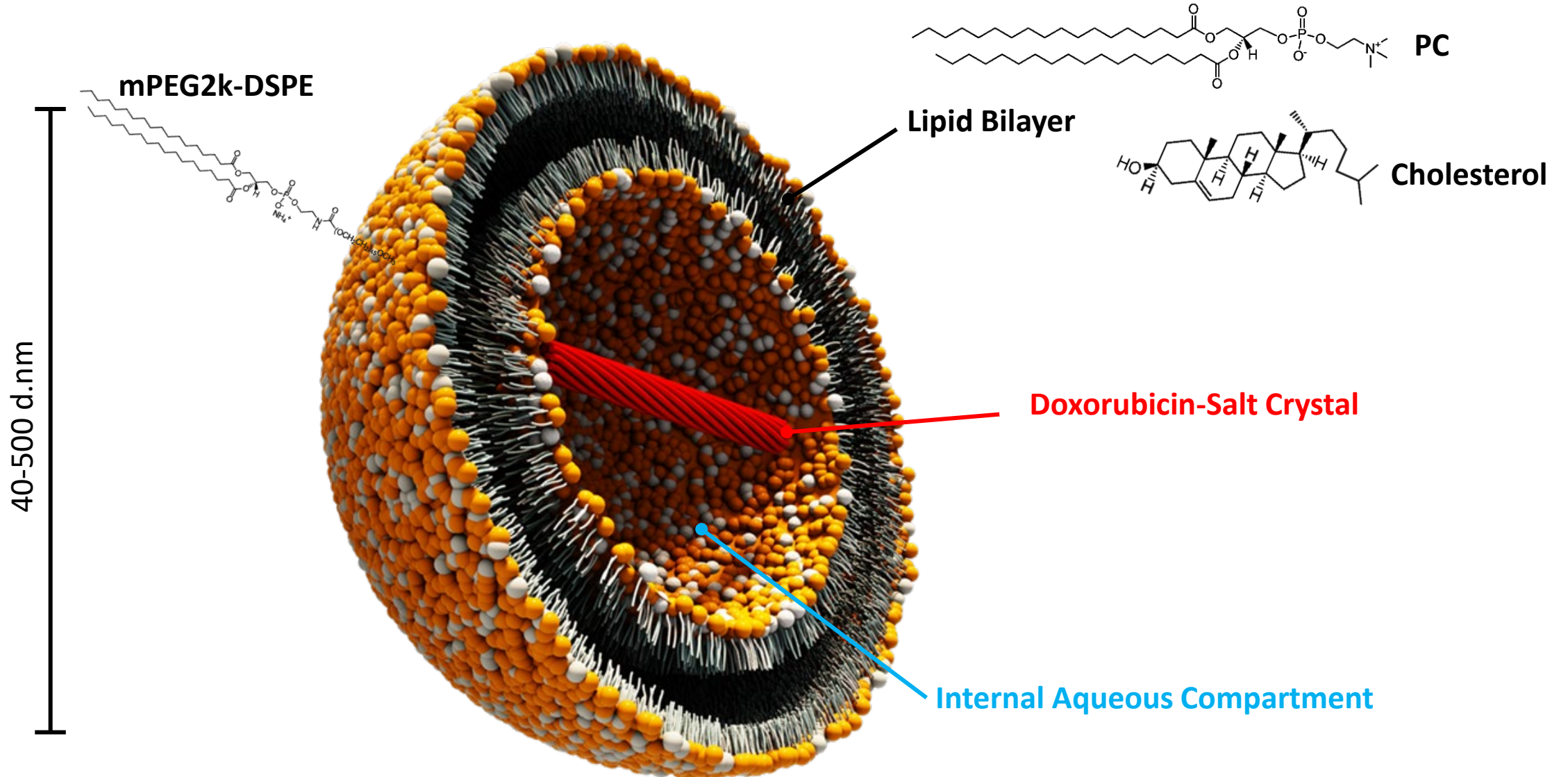
FDA Guidance on PAT Framework

## Continuous Manufacturing Benefits

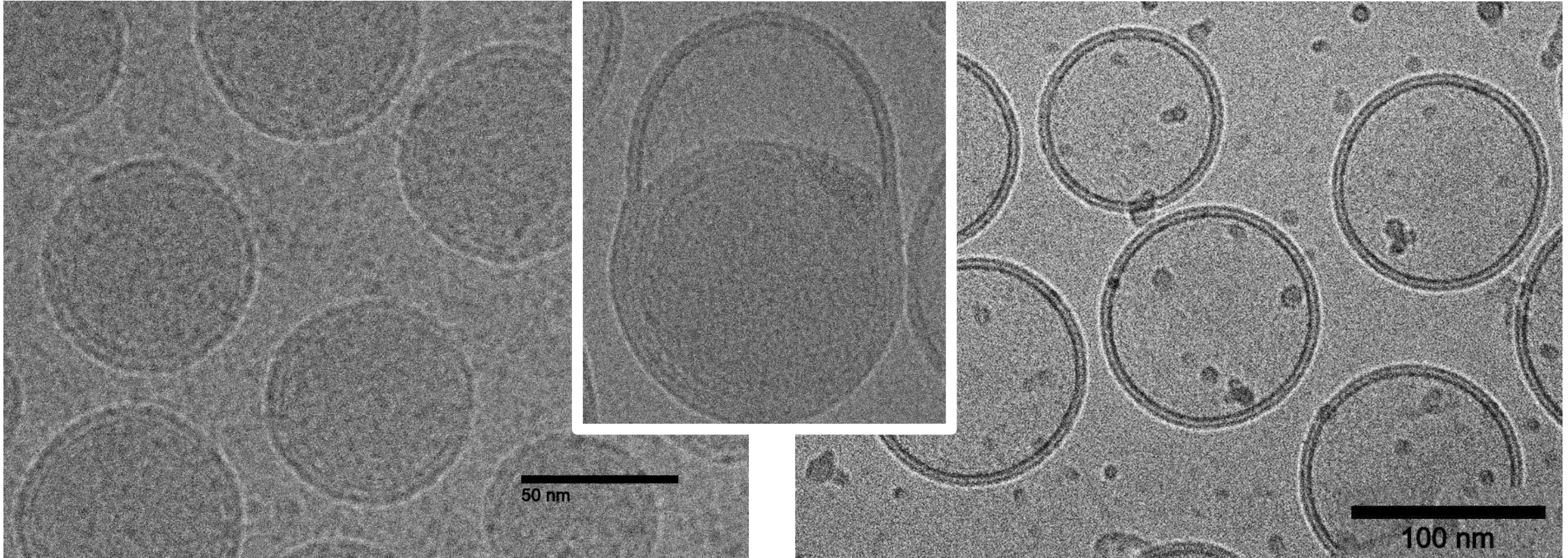
- **Higher Quality Products**
- **Faster to Market**
- **Scalable**
- **Process Analytical Technology**
  - Fine-Control of Quality Attributes
- **Reduce Product Waste**
  - Divert Process if Error Occurs
- **Reduce System Footprint**
  - Portable System
- **Reduce Human Error**
  - Reduction in Open Transfers
- **Supports End-to-End Manufacturing**



# Liposomal Nanoparticle Properties and Structure



# LNP vs Liposome Structure



## *Lipid Nanoparticles*

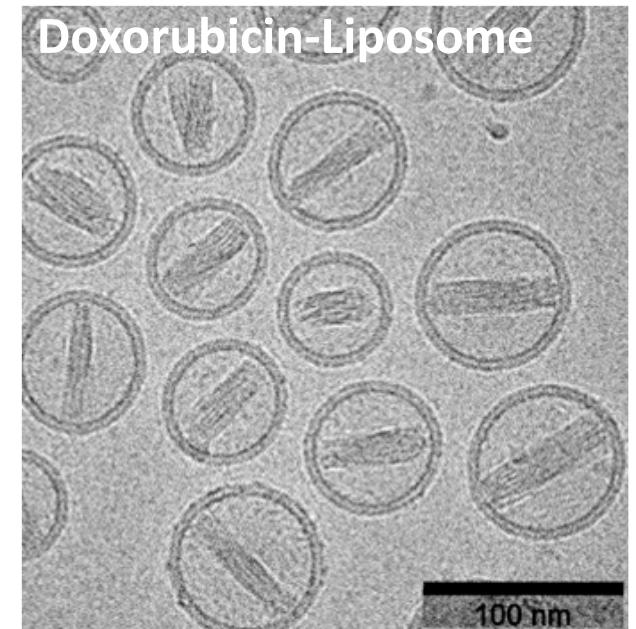
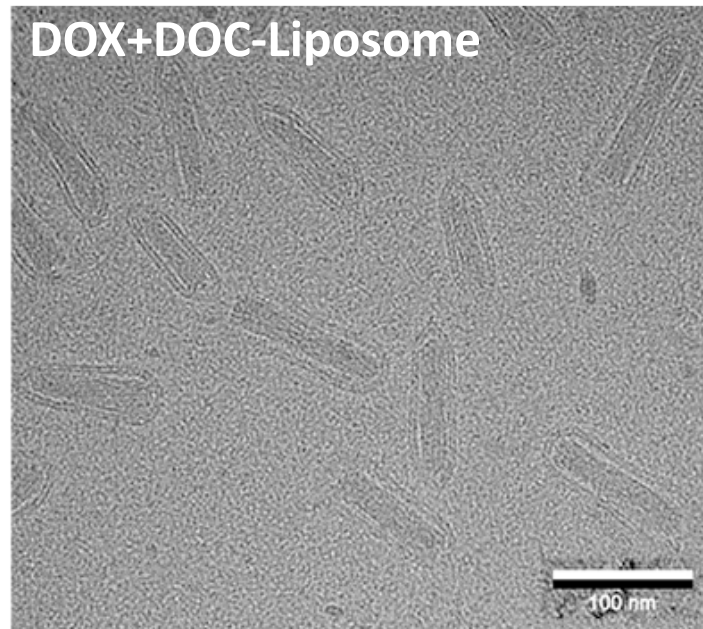
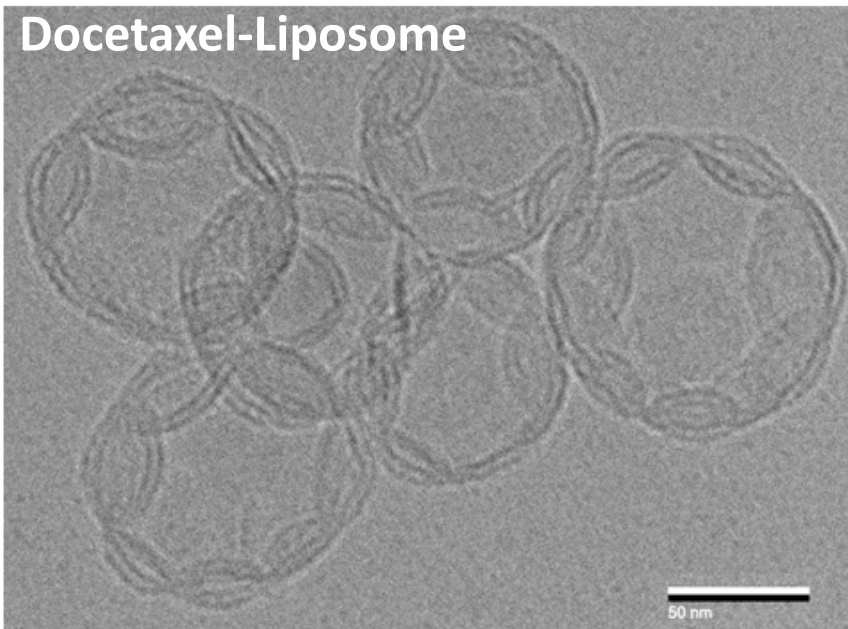
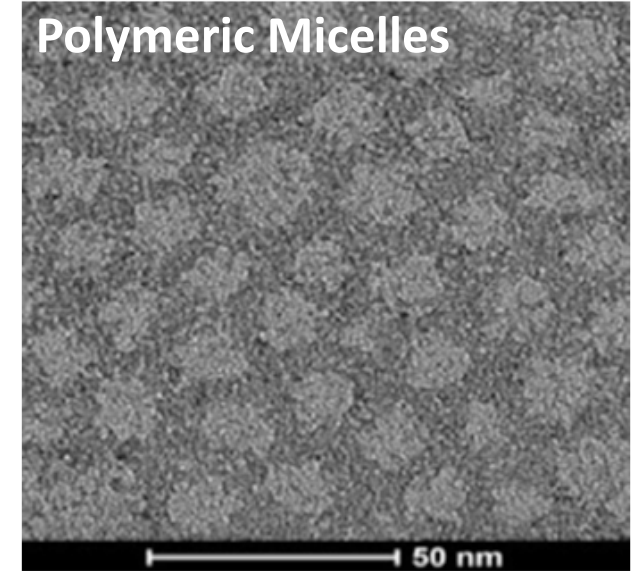
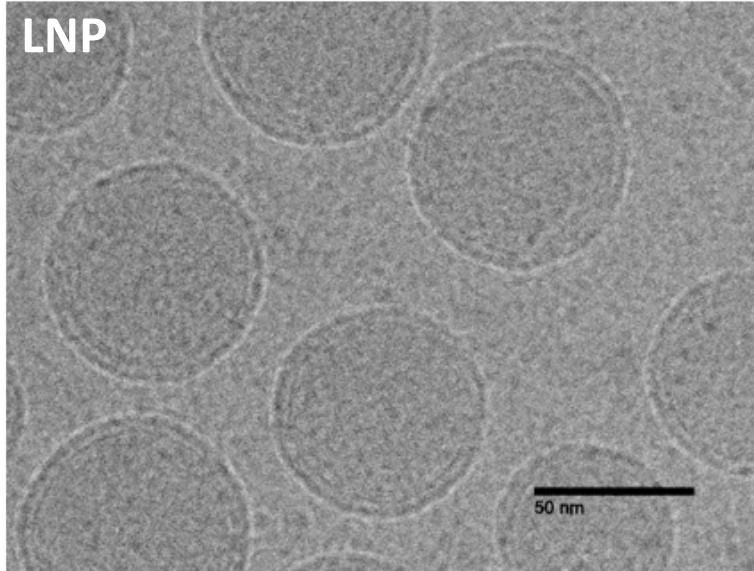
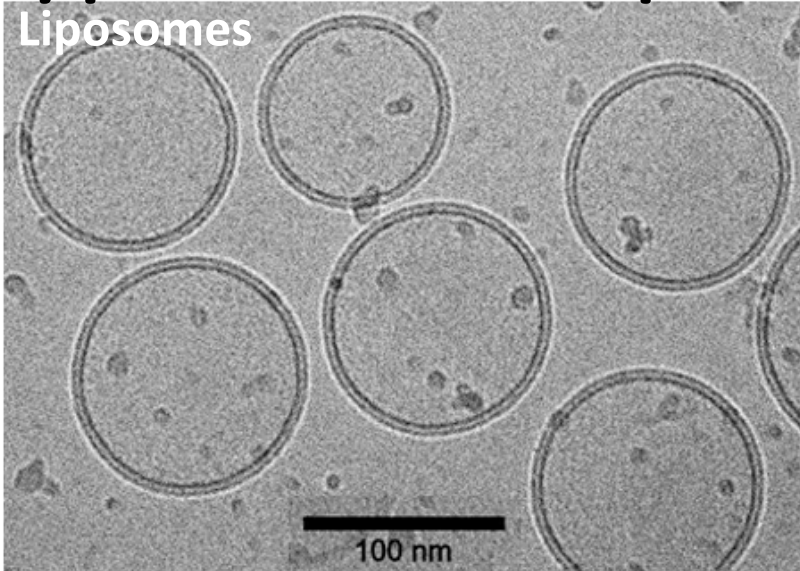
1. PC Lipid .....
2. Cholesterol .....
3. Pegylated Lipid .....
4. Ionizable Lipid
5. Nucleic Acid

## *Liposomes*

1. PC Lipid
2. Cholesterol
3. Pegylated Lipid

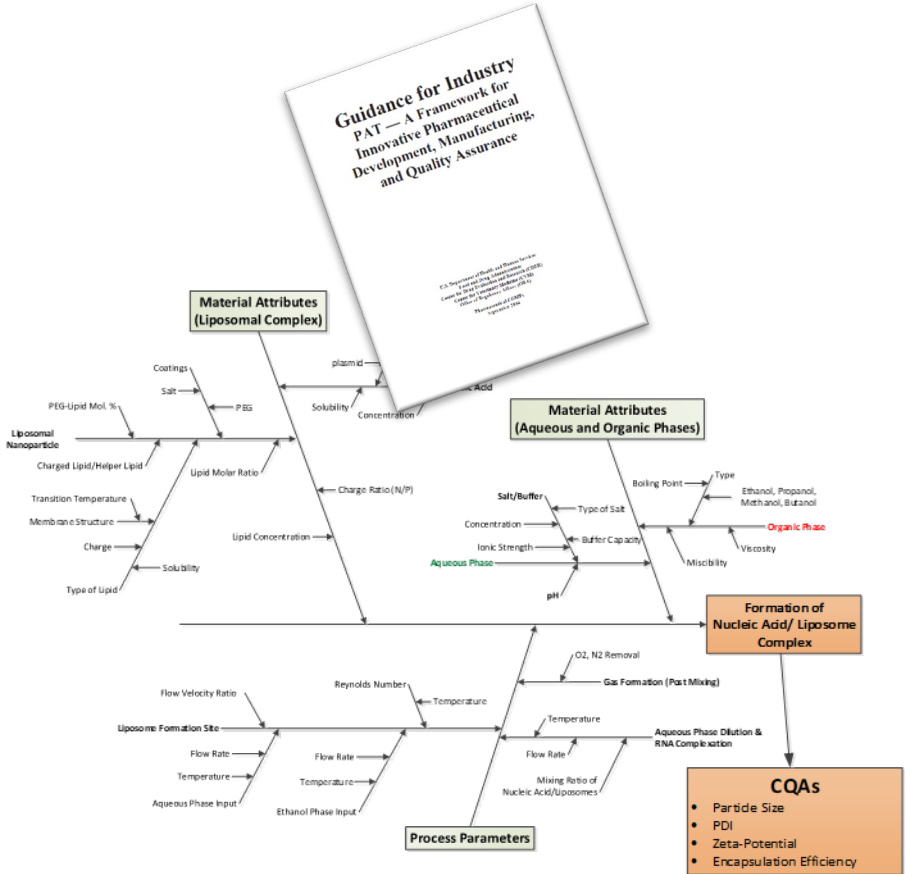


# Types of Nanoparticles





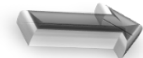
# Quality by Design - A risk-based approach to the problem



Guidance for Industry  
PAT — A Framework for  
Innovative Pharmaceutical  
Development, Manufacturing,  
and Quality Assurance

## Material Attributes

- Lipid Concentration
- Lipid Molar Ratios
- Lipid Purity
- Lipid pKa
- Lipid Headgroup
- Lipid Ionizable Species
- Aqueous Phase
  - Salt Additions
  - Organic Phase Additions



## Quality Attributes

- Particle Size
- Polydispersity Index (PDI)
- Zeta-Potential and Deviation
- Encapsulation Efficiency
- Total Drug
- Drug Loading
- Drug Crystal Structure
- Residual Solvent

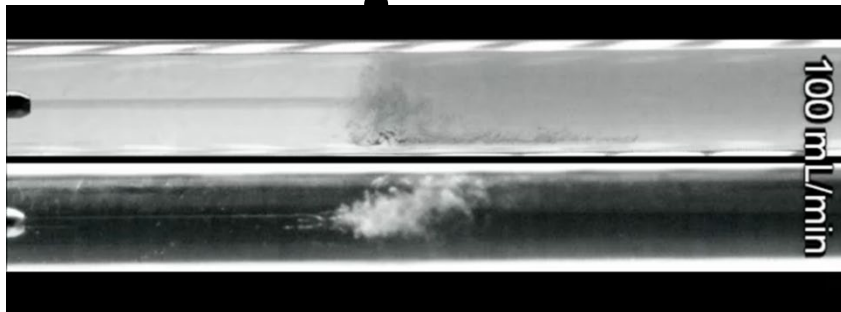
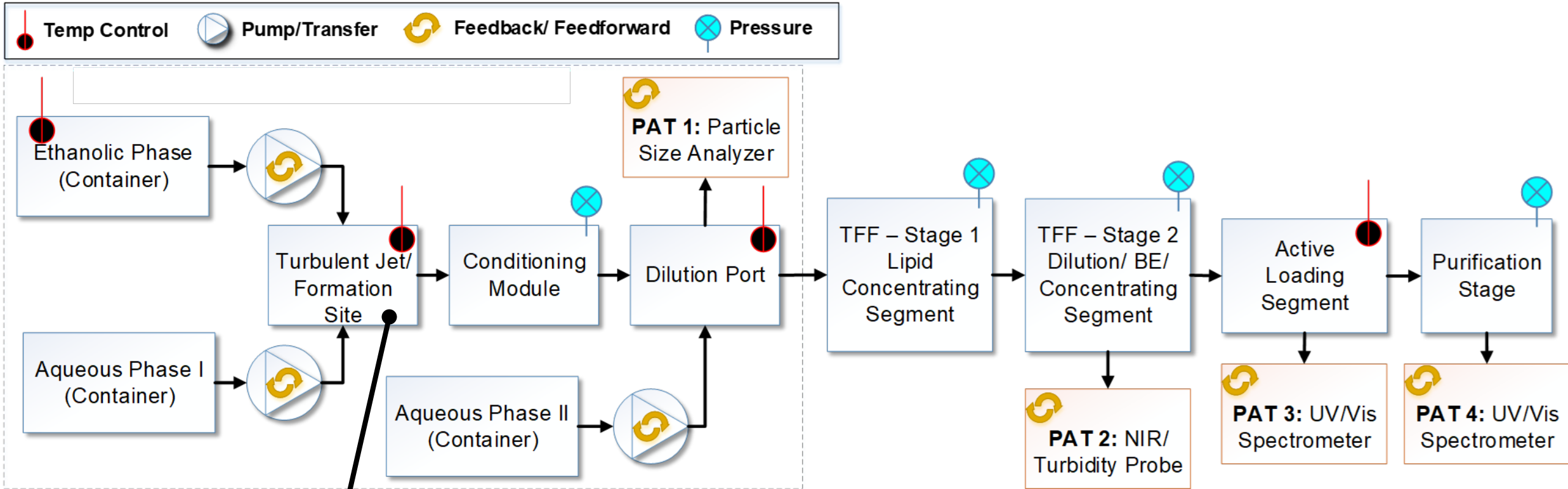
## Process Parameters

- Aqueous Flow Rates
- Ethanol Flow Rates
- Reynolds Number of Mixing
- Aqueous Phase Temperature
- Ethanol Phase Temperature
- pH of Aqueous Phase

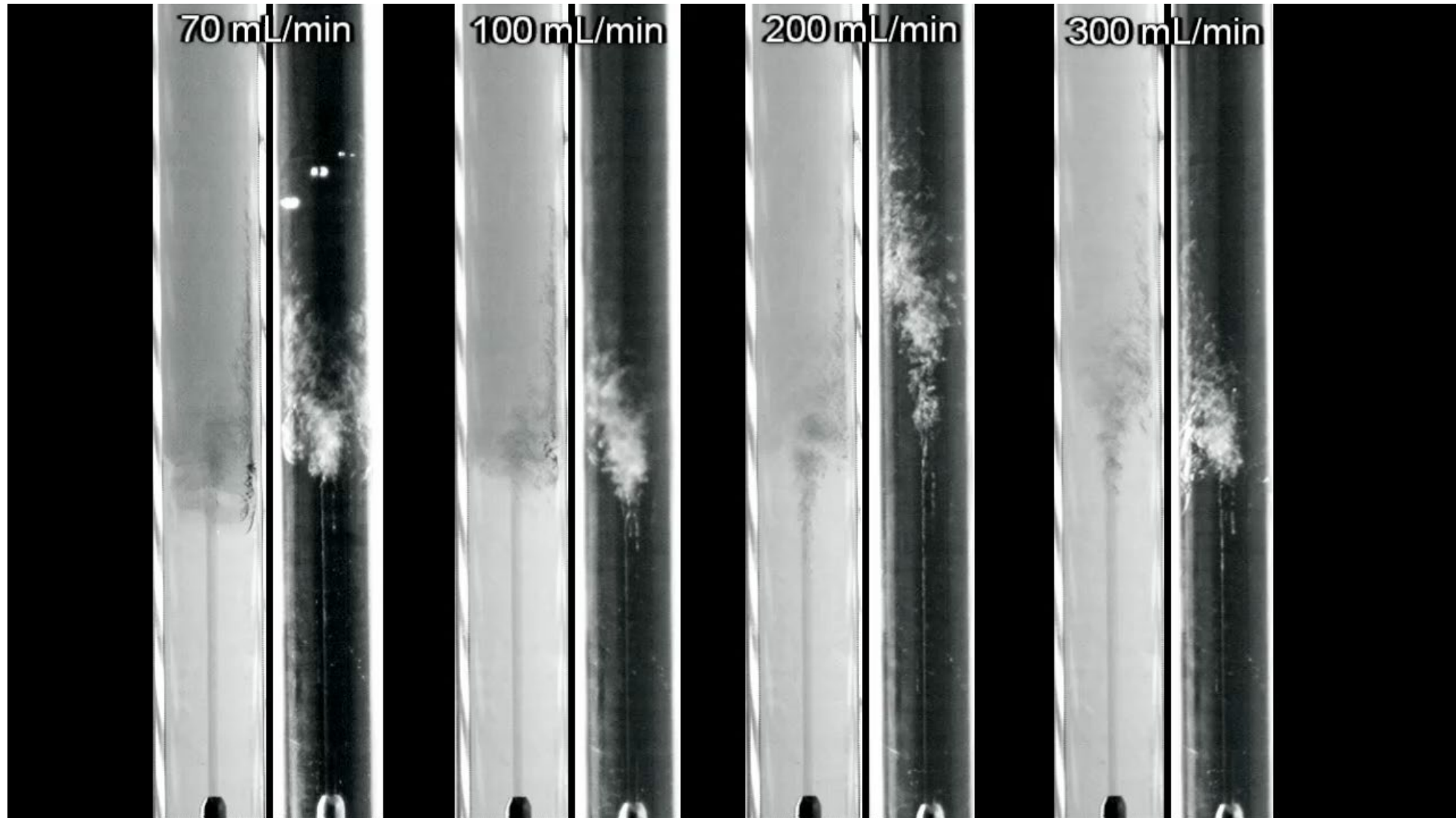


Example Ishikawa Diagram to relate material attributes and process parameters to cQAs.

# Nanoparticle Process Flow Chart



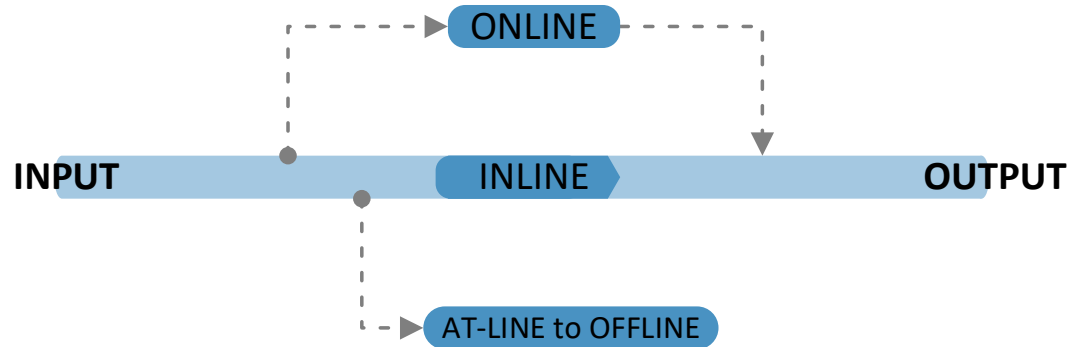
# High-Speed Camera: Jet Formation



Entire 30 second video takes place in less than 1 second...



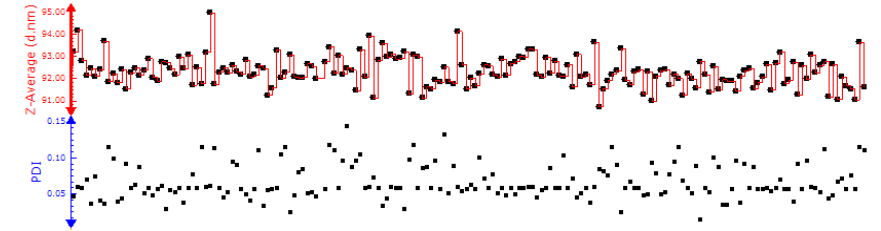
# Process Analytical Technology



**PAT Tools:** Process analyzer or one or more “soft sensors” with predictive algorithms (multivariate) to determine critical attributes.

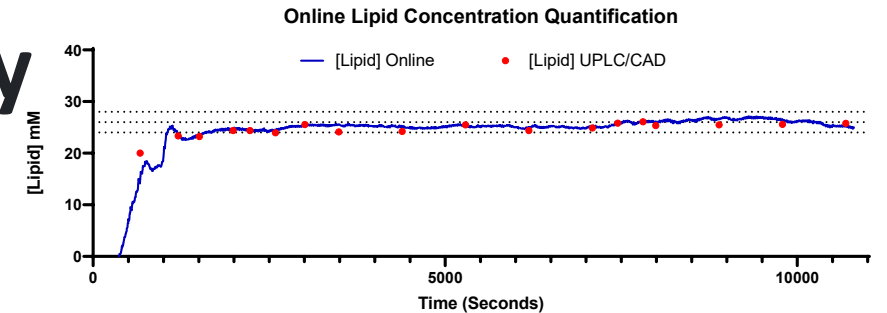
## DLS

Z-Average  
PDI



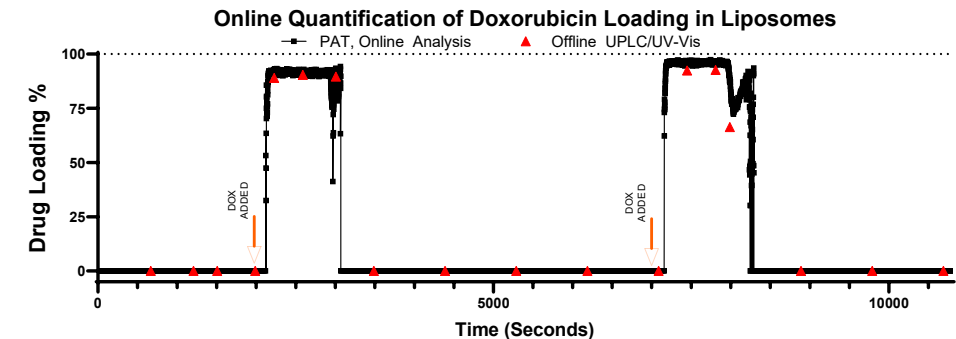
## Turbidity

[Particle]

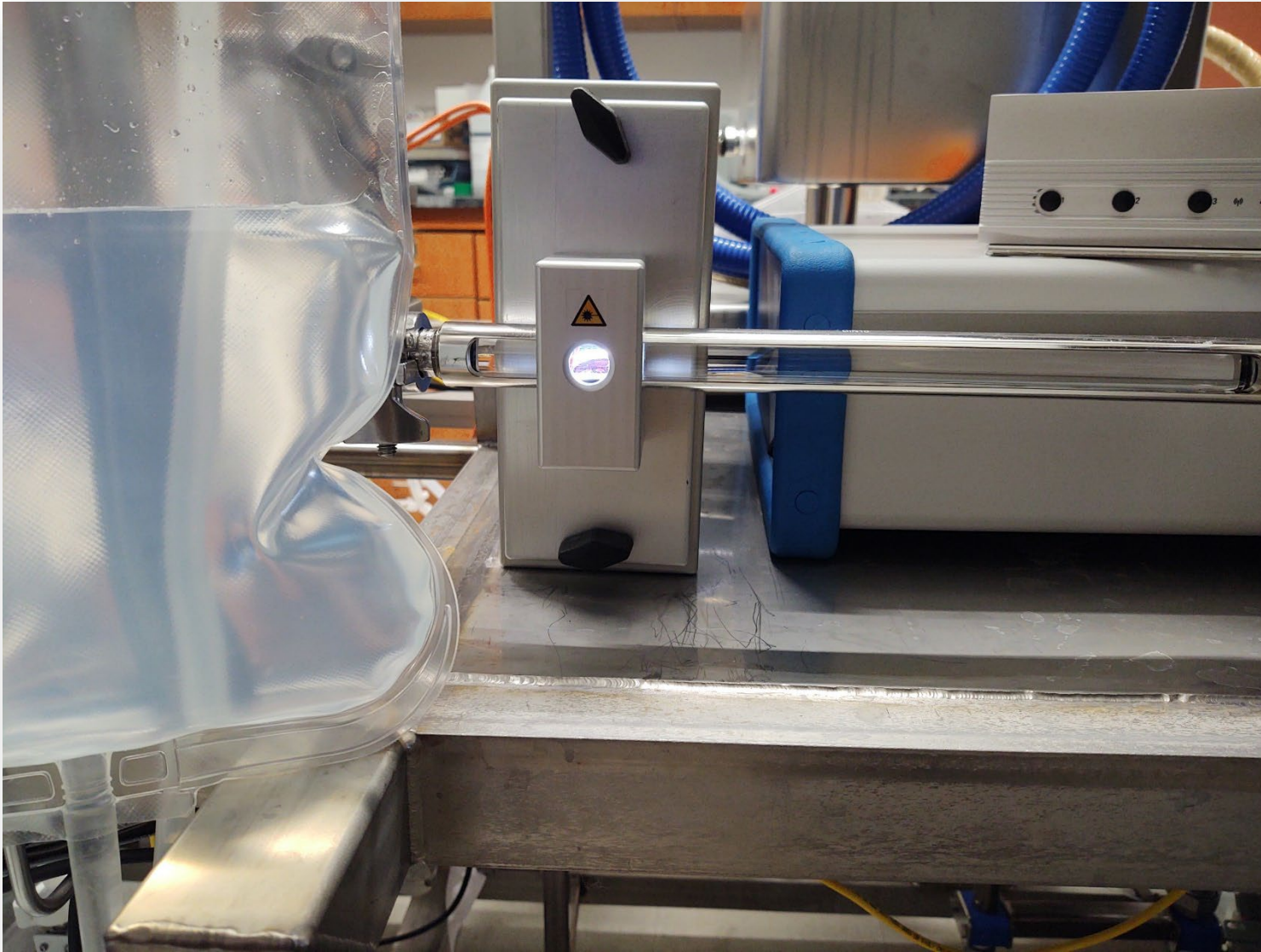


## UV/Vis

[Drug]  
%E



# PAT Integration: Particle Size Setup



## NanoFlowSizer

Spatially Resolved-DLS

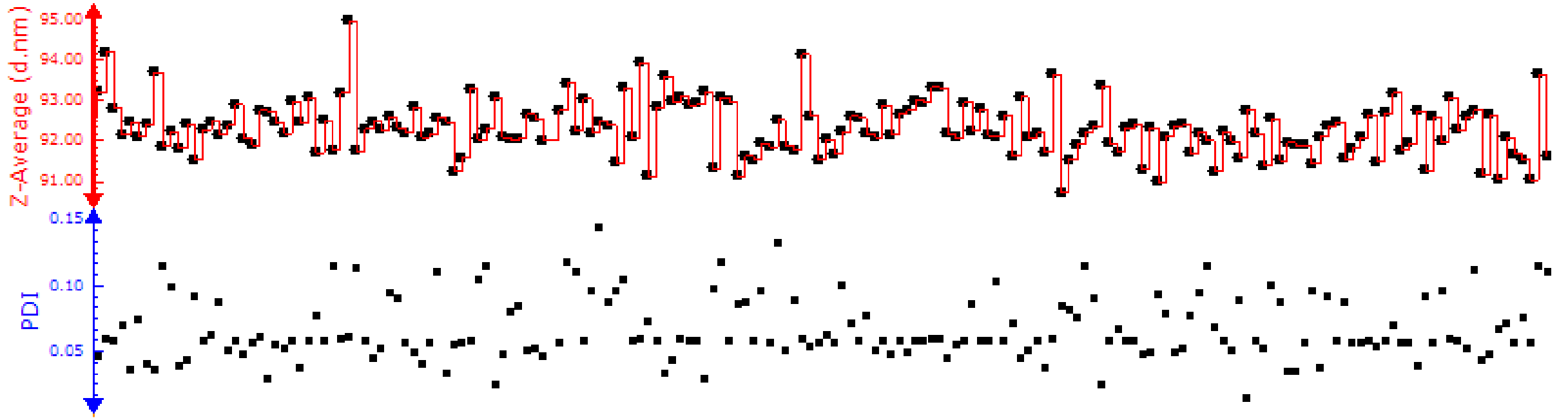
Mode: Online

Measurement Interval: <6s

### Benefits

- Rapid, online analysis
- Measurements at high flow rates
- Low and high concentrations acceptable
- Compliant Software package

# Monitor and Control of Particle Size



## Measured Attributes

1. Z-Average (d.nm)
2. CumulantPDI
3. Shear Rate
4. Temperature

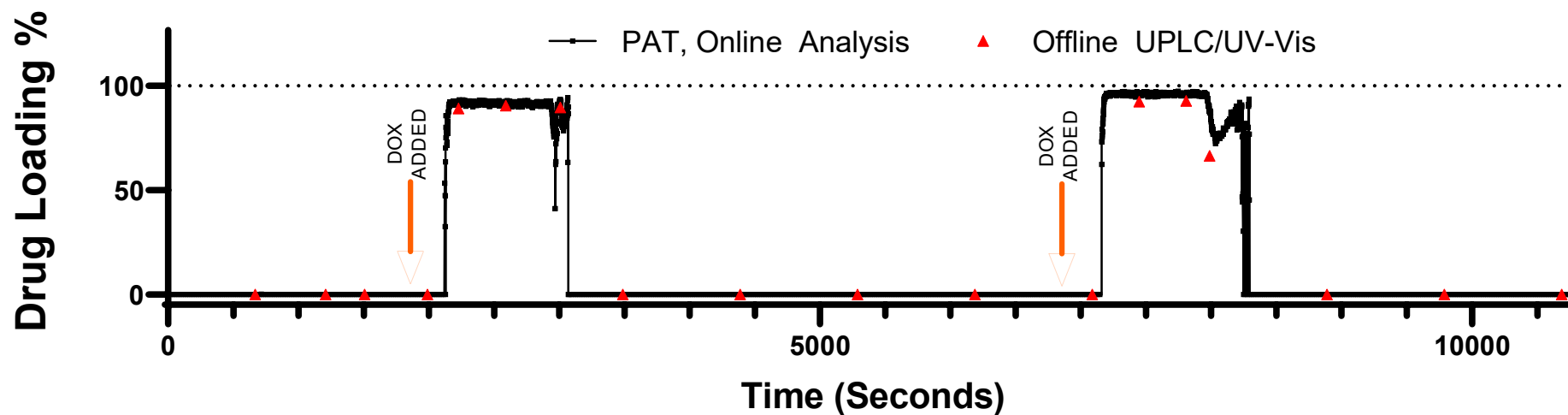
Relate intermediate liposomes at formation site to liposomes as the “end-product”.

**Predictive behavior of intermediates to “end-product”?**

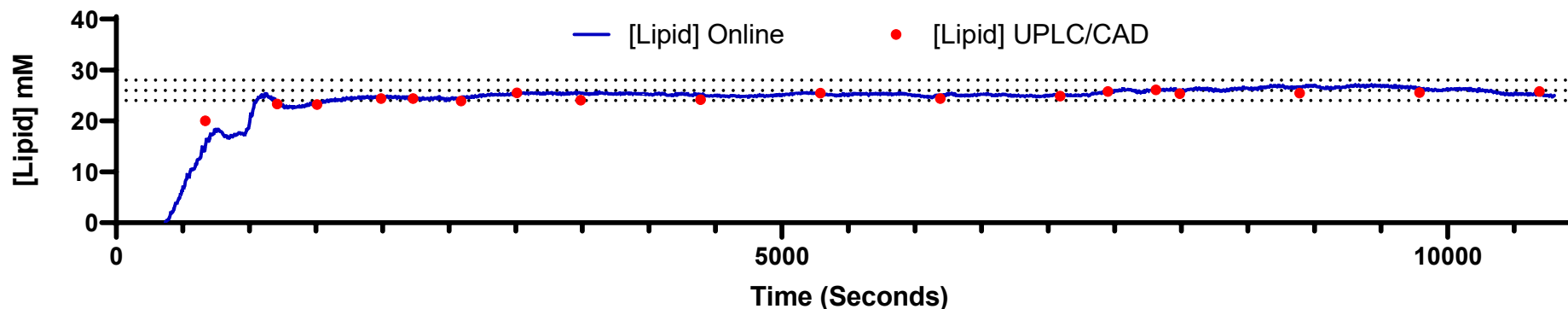


# Online Doxorubicin and Lipid Concentration Analysis

## Online Quantification of Doxorubicin Loading in Liposomes



## Online Lipid Concentration Quantification



# DOE Example: Material Attributes

**Multi-factorial Design (5x3x2x3x3 = 270 runs)**

**Lipid Formulation: (Main Lipid Type):Chol:DSPG**

DSPG was fixed at 5% molar ratio.

## Factors

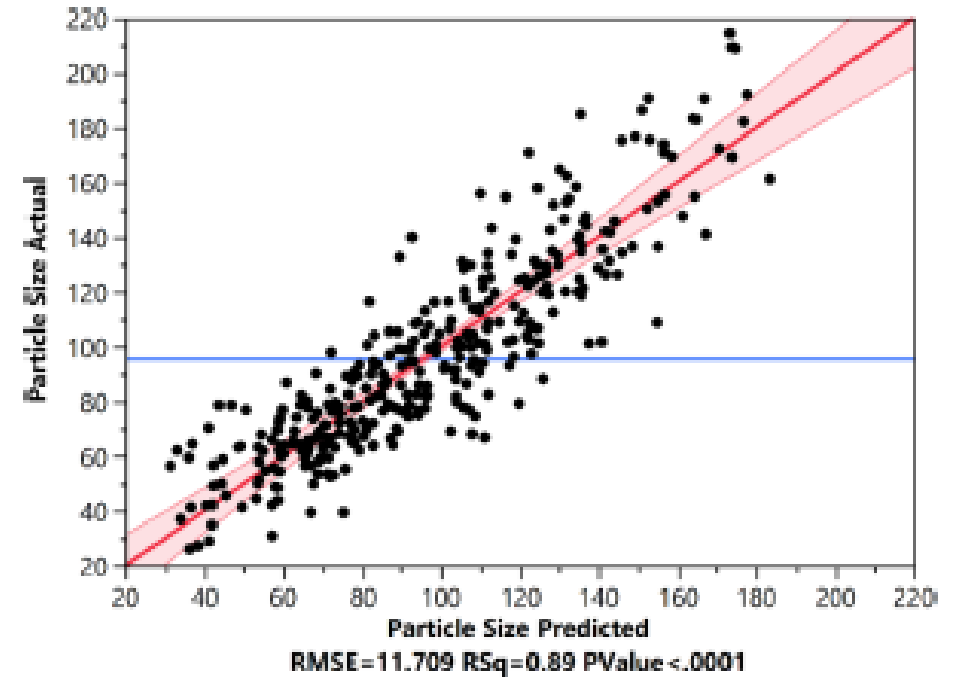
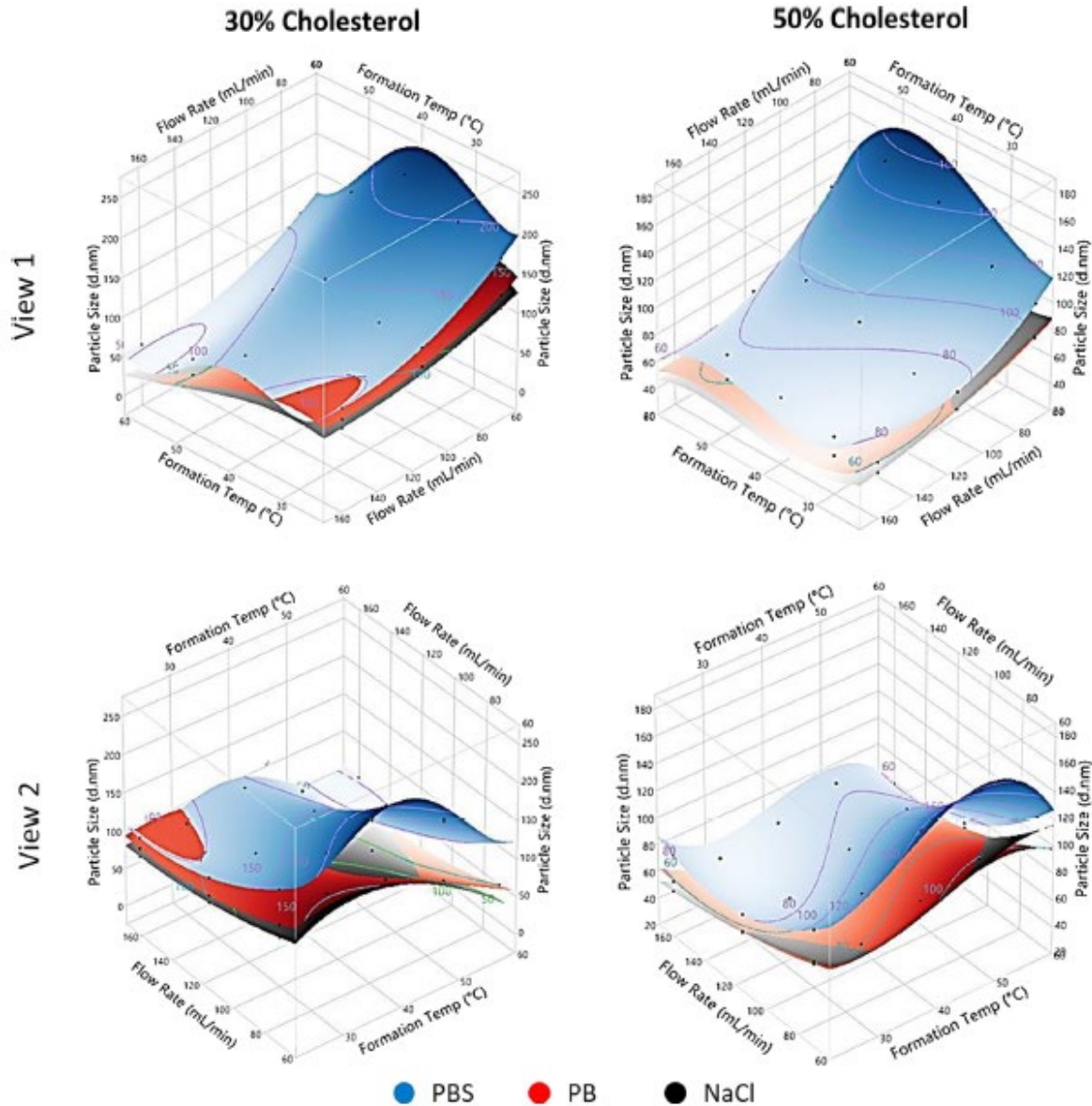
- Post Formation Temperature (20-60°C)
- Aqueous Phase Flow Rate (70-160 mL/min)
- Cholesterol Percentage (30-50%)
- Main Lipid Type (**DMPC** vs **DPPC** vs **DSPC**)
- Aqueous Phase Salt (**PBS**, **PB** or **NaCl**)
  - pH set to 7.45 for PBS and PB.



## Responses

- Z-Average Particle Size
- PDI (Polydispersity Index)
- Zeta-Potential

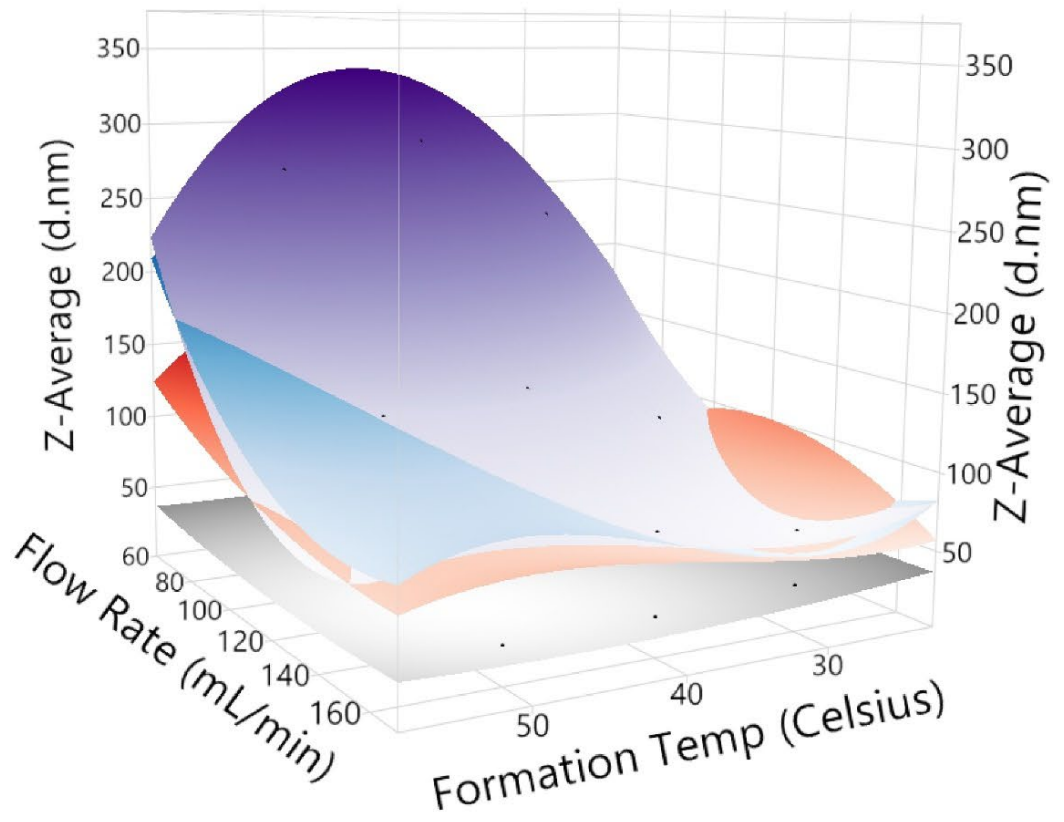
# HSPC-based liposomes



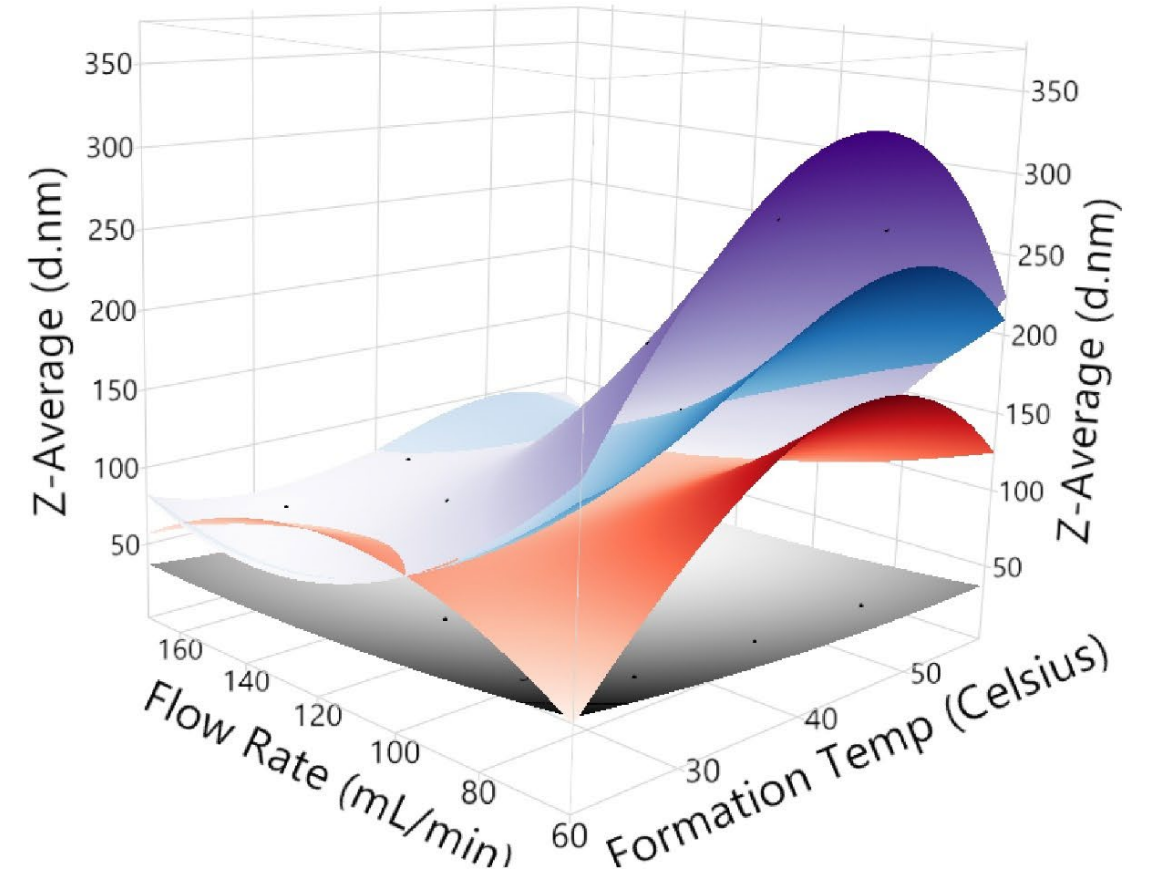


# Type of Lipid on Size

● DOPC    ● DMPC    ● DPPC    ● DSPC

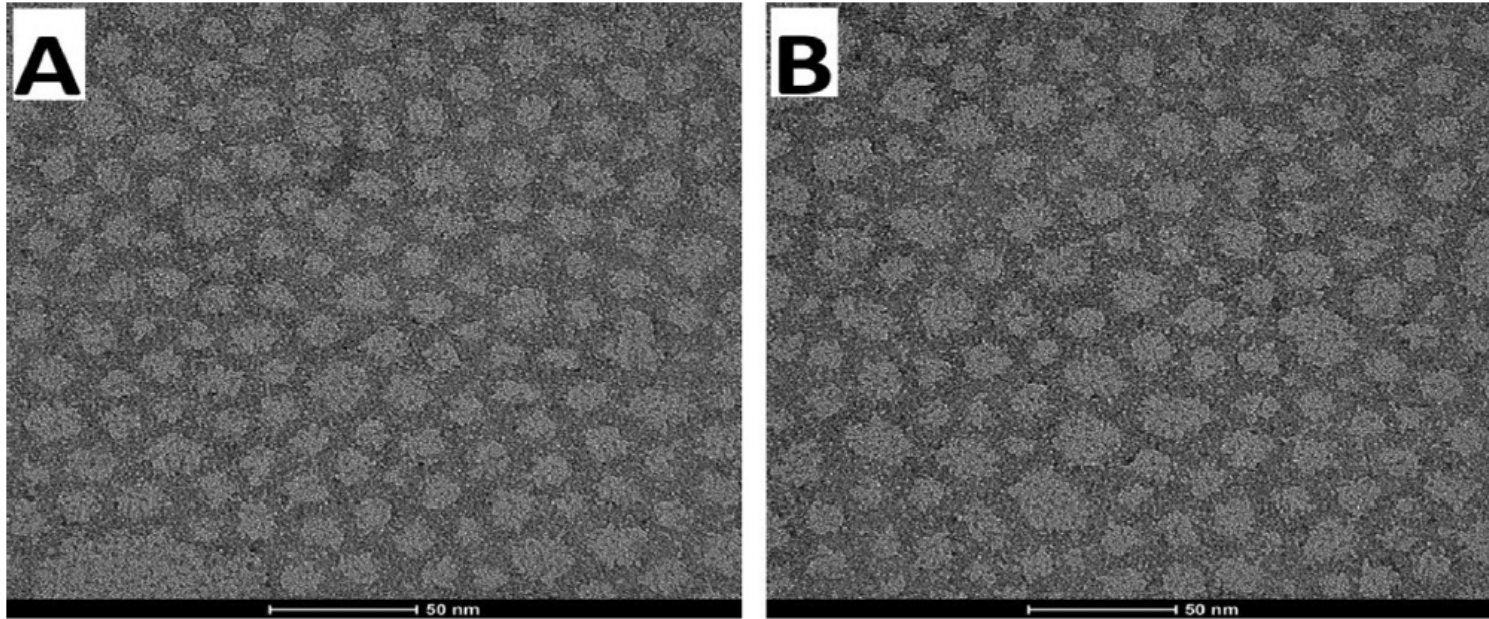


View 1

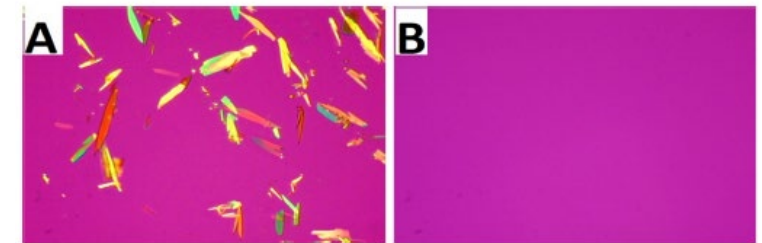


View 2

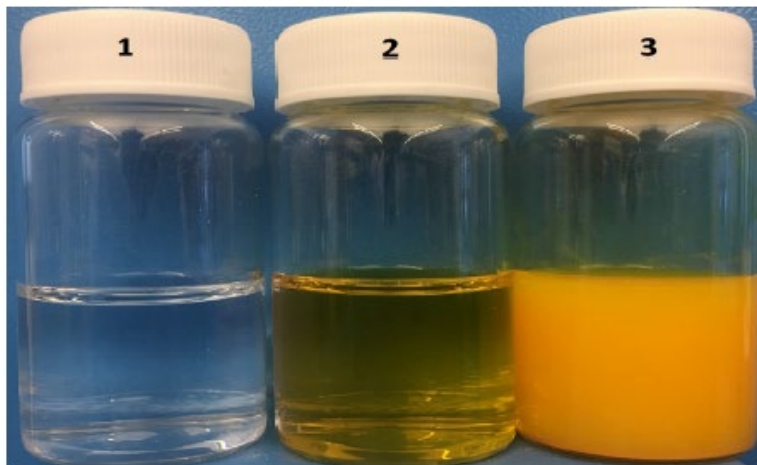
# Formulation and Characterization of Polymeric Micelles



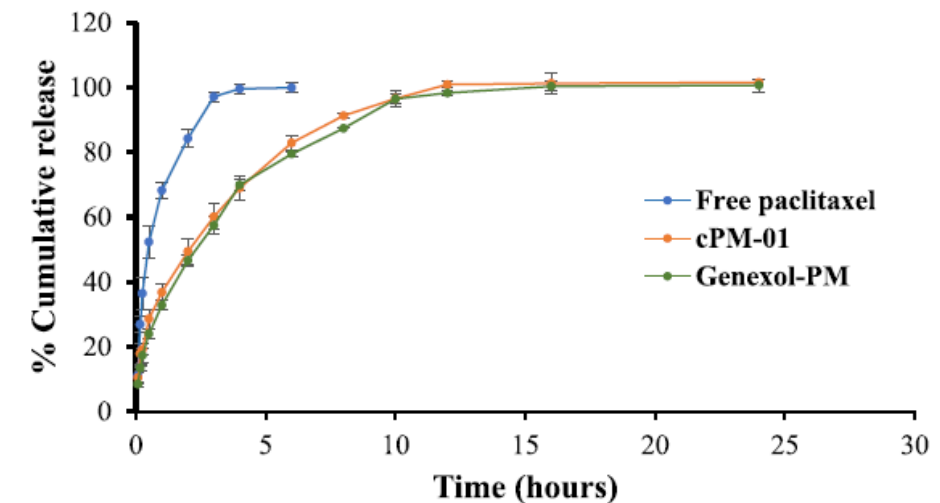
Transmission electron microscopy images of: (A) blank; and (B) curcumin-loaded micelles.



Polarized light microscopy images of: (A) free curcumin (5% ethanol in water); and (B) curcumin-loaded polymeric micelles (5% ethanol in water).



Appearance of: (1) blank polymeric micelles, transparent; (2) curcumin-loaded polymeric micelles, yellow transparent; and (3) free curcumin in water, yellow opaque.



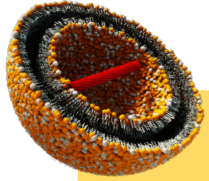
# Case Study: Liposomal Doxorubicin

*Performed at*

**URI Pharmaceutical Development  
Institute Training Center**



# Liposomal Doxorubicin Specification



Parameters	Brand Name/ Batch Process	Continuous Processing
Lipid composition	HSPC/Chol/mPEG2000-DSPE (56.3:38.4:5.3 mol%)	
[Lipid]	20 mM	
[Doxorubicin-HCl]	2 mg/mL	
Drug Encapsulation	>90% Leaflet 99% Tested	>95% No Purification >99% Post Purification
Loading Battery	Ammonium sulfate 250mM	
External Buffer	10mM histidine, pH 6.5 + 10% Sucrose	
Particle Size (d.nm)	80-85 nm (DLS)	

# System in Clean-Room Suite



Cleanroom at URI, UConn System front and back views

# Procedures and Overview

1. Gowning procedures
2. Draft batch record
3. Draft cleaning SOP
4. System SOPS
  - Run-time Recipes
5. Environmental monitoring report
6. Cleaning cycle development report
  - Executed UCONN cleaning cycle form
7. Personnel monitoring

Example Run-time Recipe

The screenshot displays the UCONN software interface for configuring a run-time recipe. The main window is titled "UCONN - Sequence: URI FULL RUN - Configuration". It features a "Master Recipe" table with columns for time (0-31) and rows for various process steps. A tooltip for "Step #3: RUN 10 MIN LIPID" is visible over the grid. A "Phase Configuration" dialog box is open, showing parameters for "Phase: Runtime Oper" and "Step: 3. RUN 10 MIN LIPID".

Recipe Name: URI FULL RUN    Product Code:    Version: v.01    Version Date: 4/23/2021

**Master Recipe**

	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Prompt																																
Wait																																
Prime Pumps																																
Runtime Oper																																
TFF1 Std Run																																
TFF2 Std Run																																
Aqueous Drug																																
TFF3 Std Run																																
TFF3 V1500																																
Post Run Lo Flow																																
Post Run Clean																																
TFF1 Cleaning																																
TFF2 Cleaning																																
TFF3 Cleaning																																
TCU-100 200 400																																
TCU-1000 1200																																
TFF1 Std Run CV																																
TFF2 Std Run CV																																

Author: \_\_\_\_\_

**UCONN - Sequence: URI FULL RUN - Phase Configur...**

Phase: Runtime Oper    Step: 3. RUN 10 MIN LIPID

Active

**Parameters**

Aqueous Phase 1	150.00	mL/min
E1 Concentration	5.00	%
Ethanol Phase	40.00	mL/min
DG-400 Degassing	28.00	psi

14.64

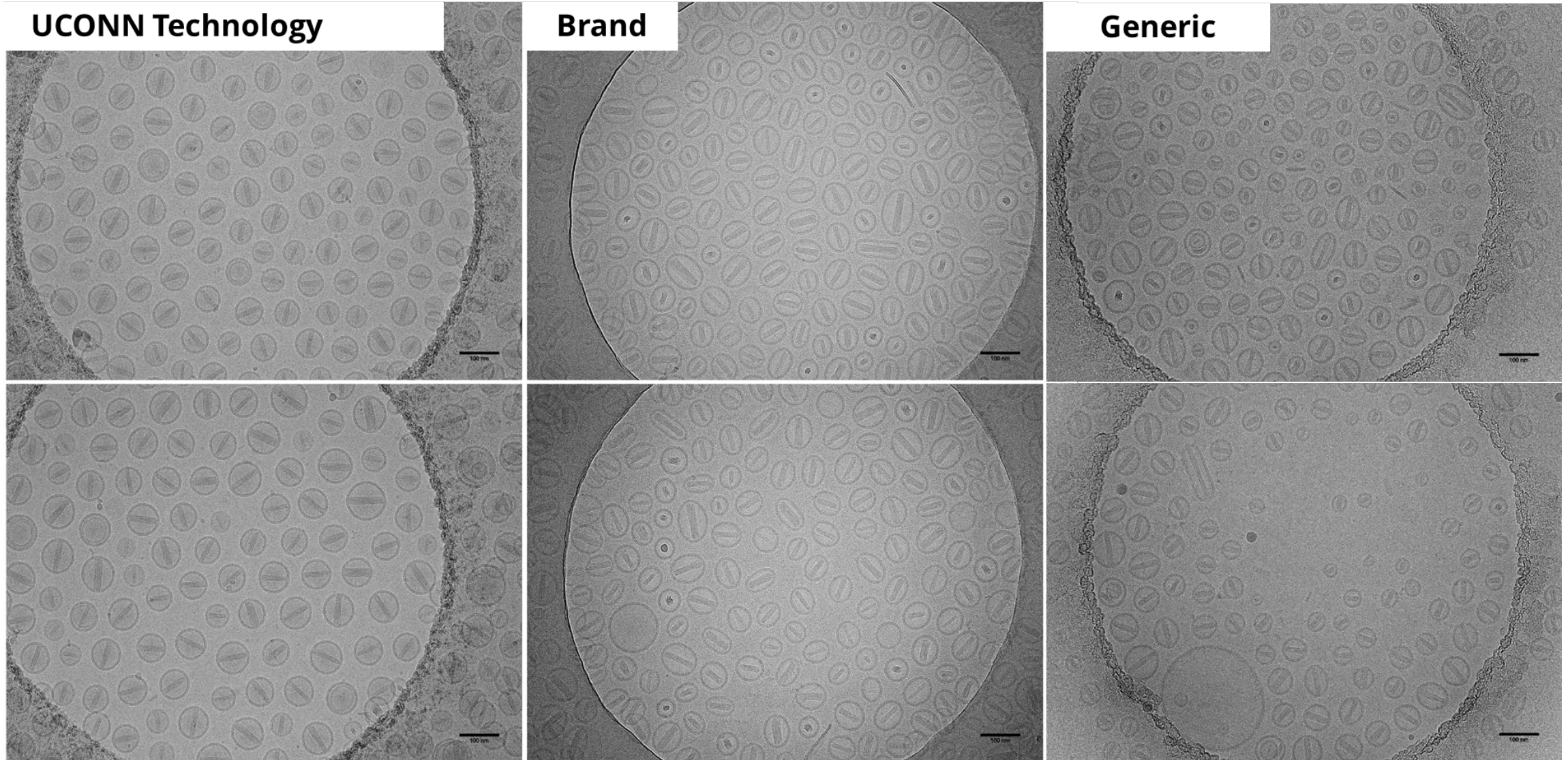


# Final Particle Size Results (n=3)

<b>Sample Name</b>	<b>Z-Ave (d.nm)</b>	<b>PDI</b>	<b>EE (%)</b>
D29t-Run 1	87.54	0.027	85%
D29t-Run 2	86.45	0.035	83%
E5t-Run 3	87.94	0.035	90%
<b>AVERAGES:</b>	<b>87.3</b>	<b>0.032</b>	<b>86.0%</b>
<b>STDEV:</b>	<b>0.771</b>	<b>0.005</b>	<b>3.6%</b>

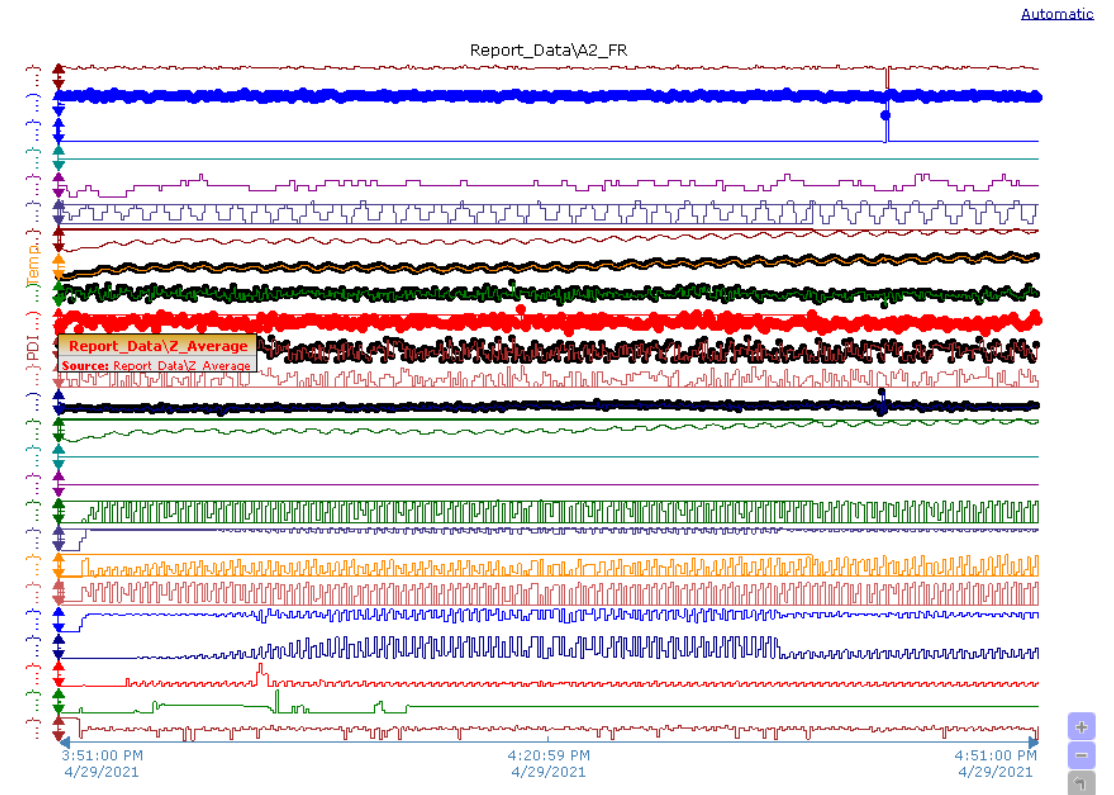
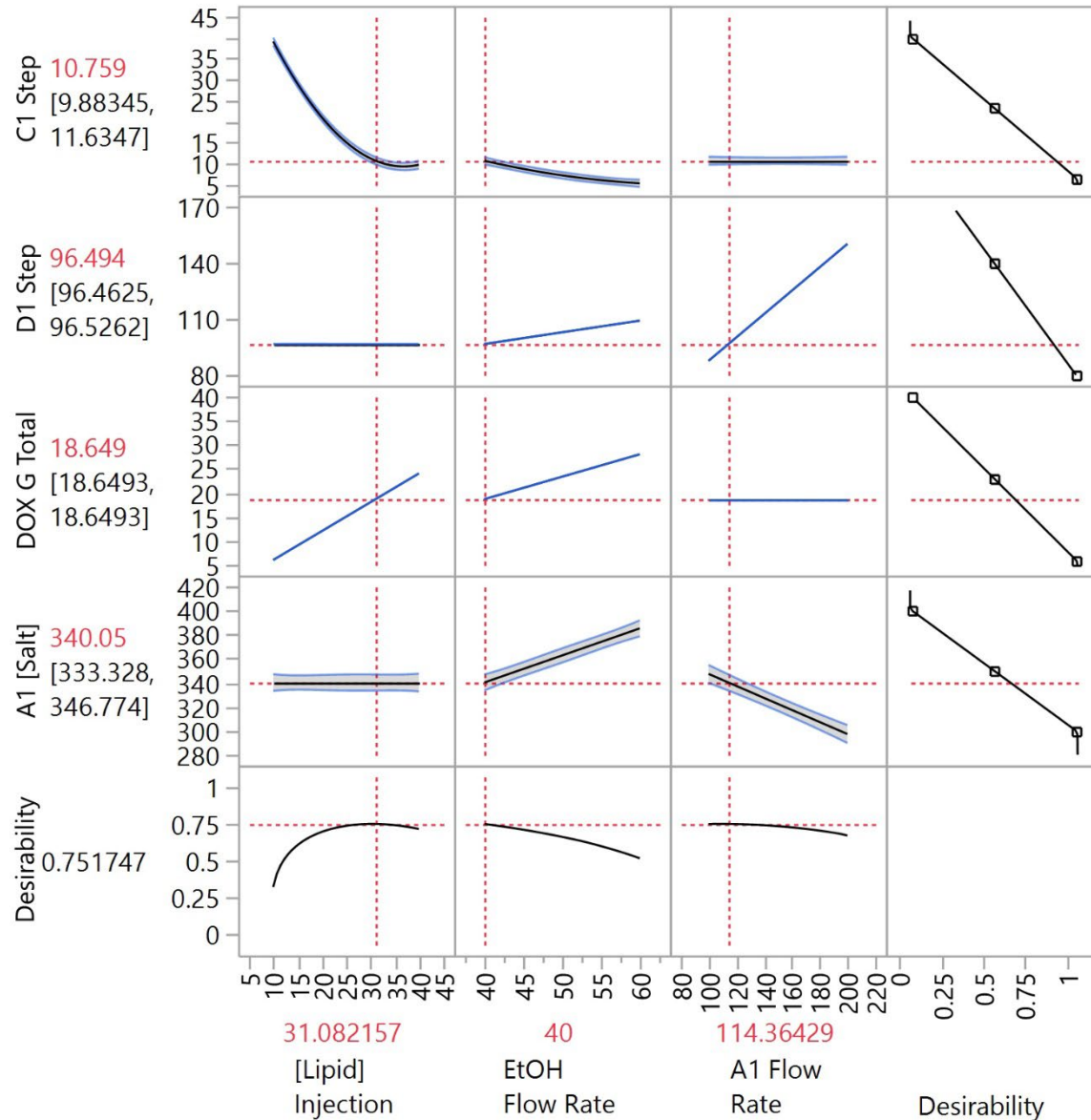
- Three runs with cleaning in-between each run cycle.
- EE% is the drug encapsulation of doxorubicin in the liposomes.
  - Lower than expected, heating stage was lower.
- Runs were successful.
  - Low standard deviations and percent errors are reported.

# Cryo-TEM of Liposomal Doxorubicin



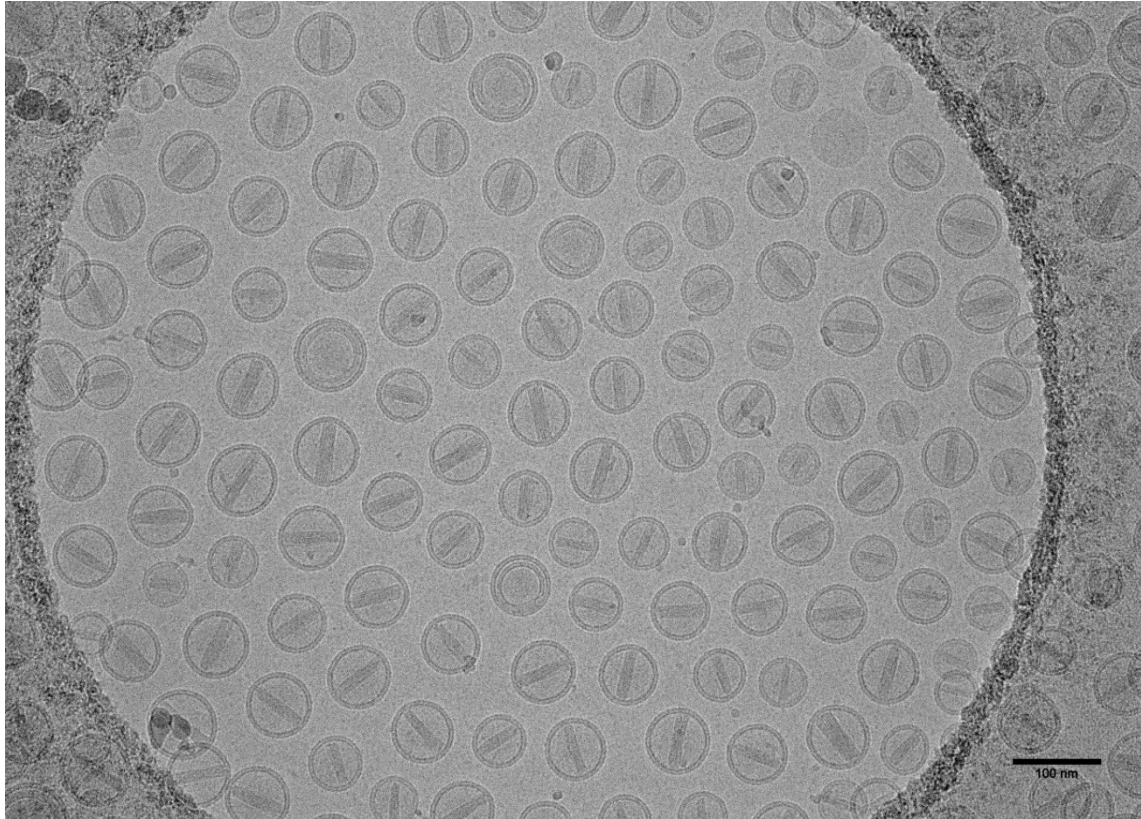
# Control Strategy: towards a working Design Space

Use of Design of Experiments provides a framework to optimize conditions and run automation.

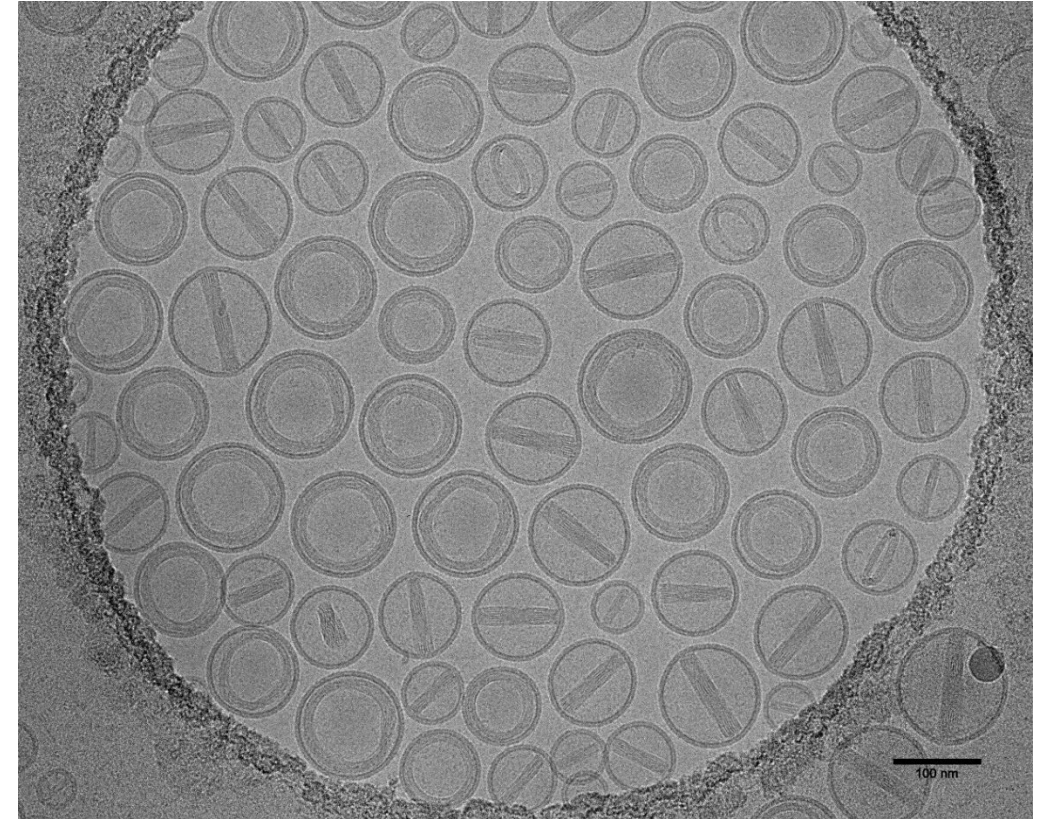




# Controlled API/ Crystal Morphology (Anti-cancer)



DLS: 86.68 d.nm

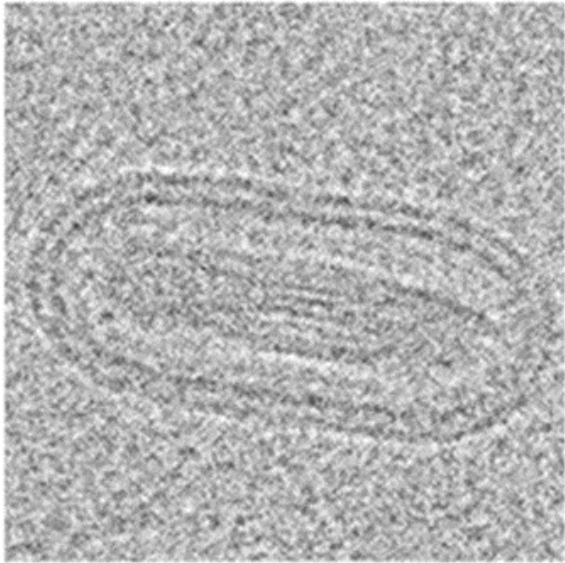


DLS: 123.33 d.nm

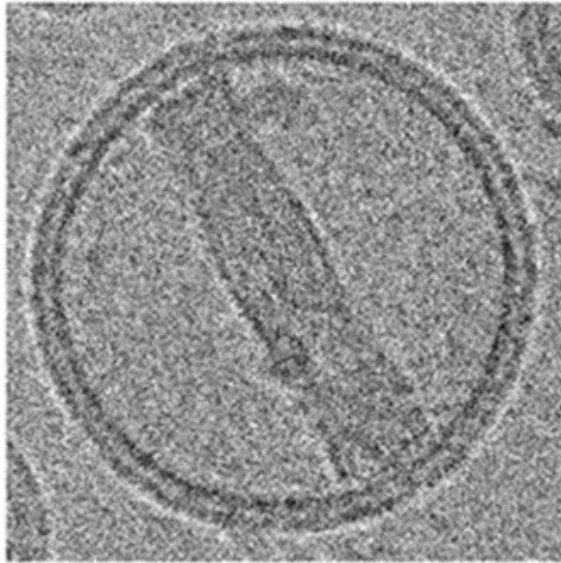
Linear crystal vs. spherical crystal  
For small-molecule anti-cancer therapies

# Structures in Liposomal Doxorubicin

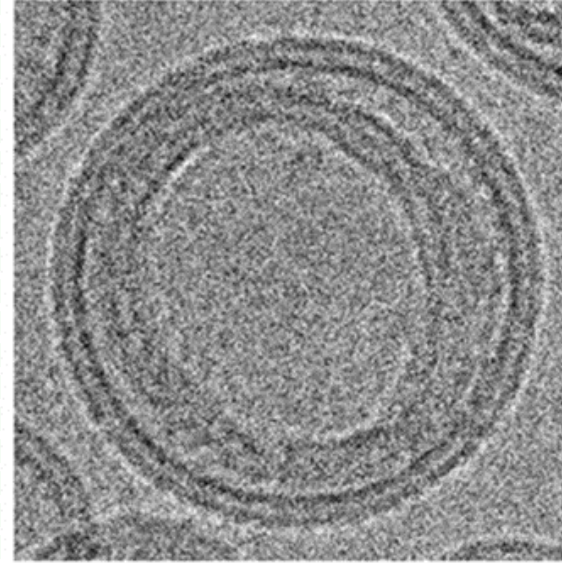
Majority of Particles



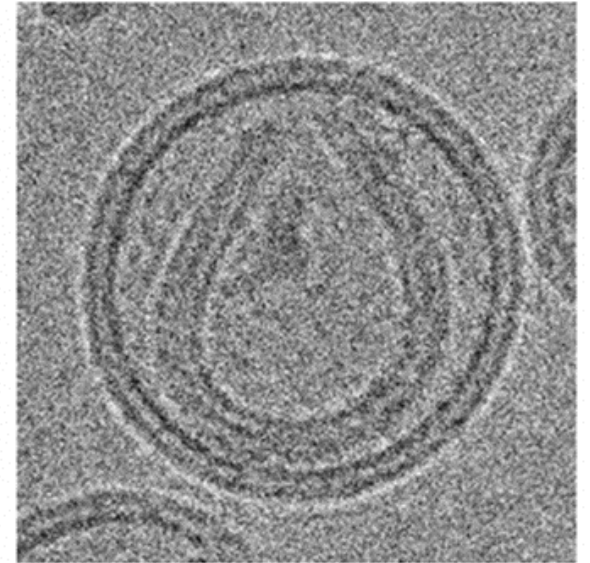
Elongated, Linear  
Nanocrystal



Spherical, Linear  
Nanocrystal



Spherical, Circular  
Nanocrystal

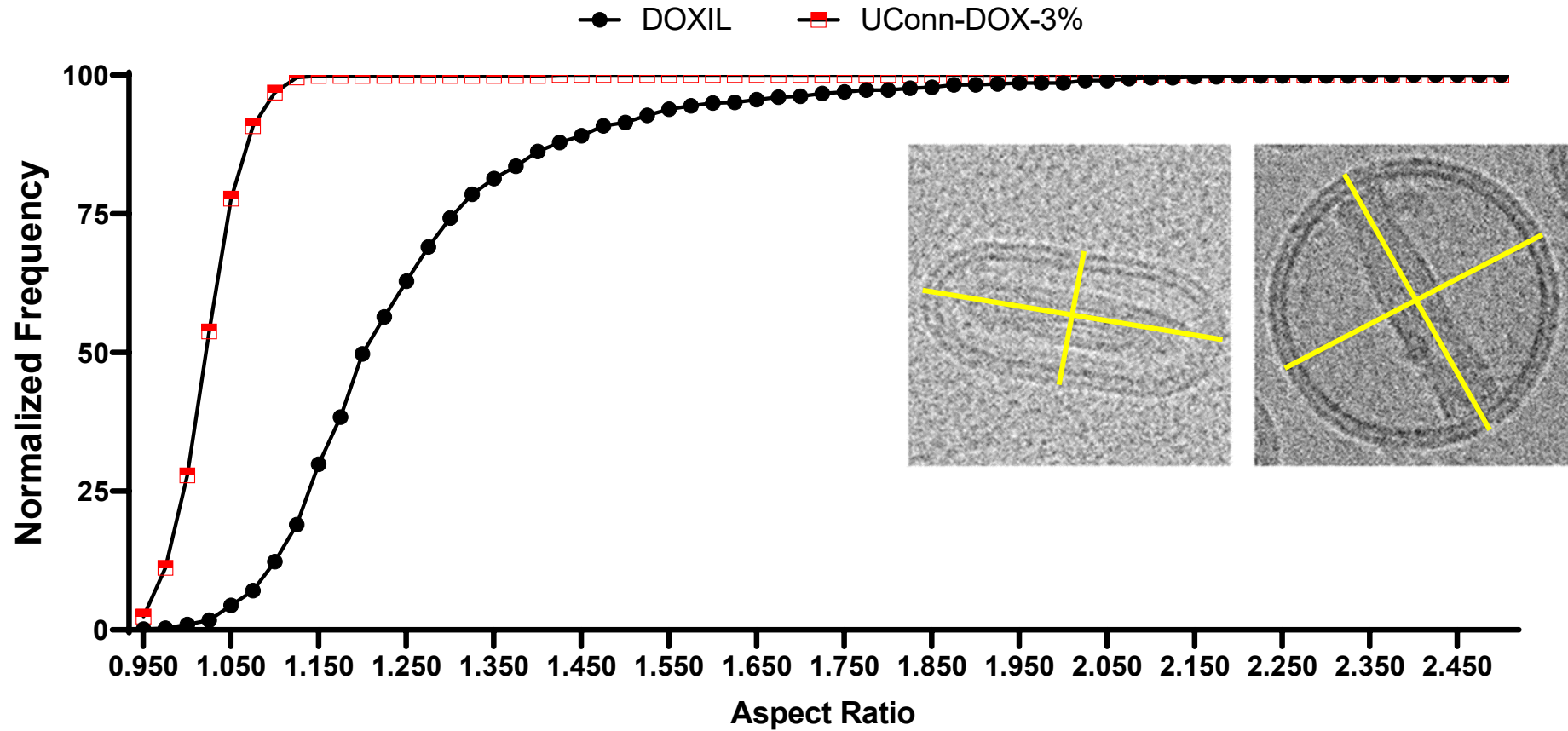


Spherical, U-Shaped  
Nanocrystal

Crystal shape impact on clinical adverse events? PK Data?

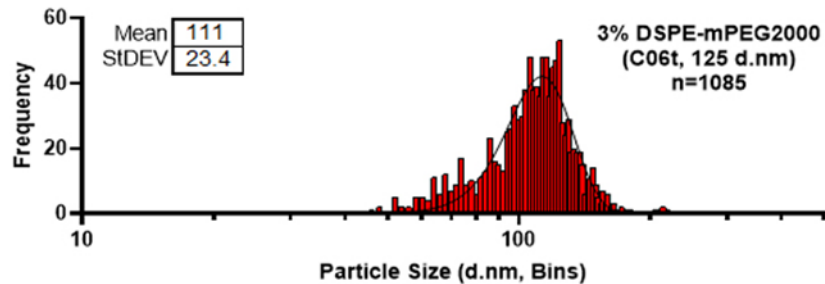
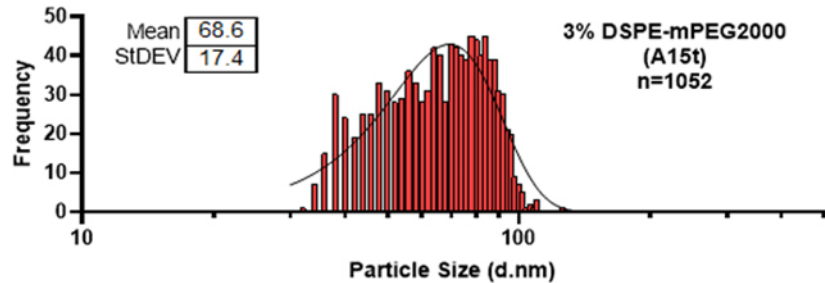
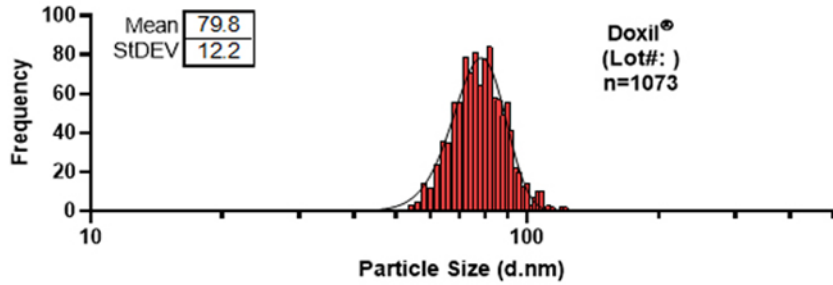
# Aspect Ratio of Salt Crystal

## Cumulative Frequency Distribution of the Particle Aspect Ratio

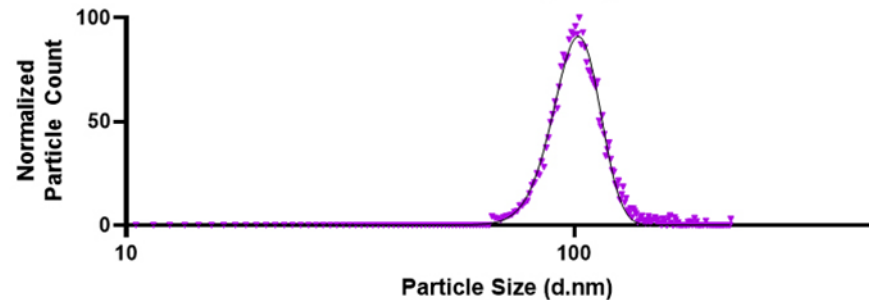
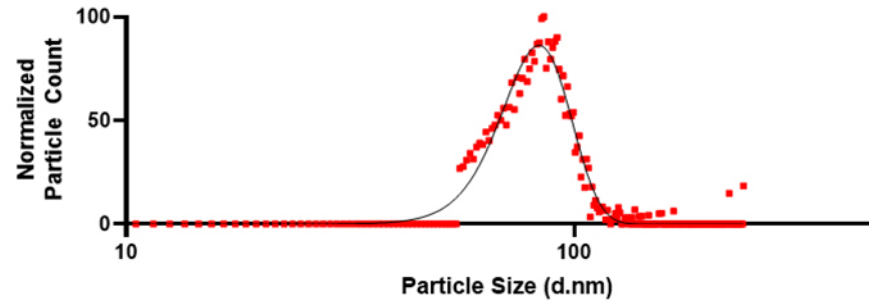
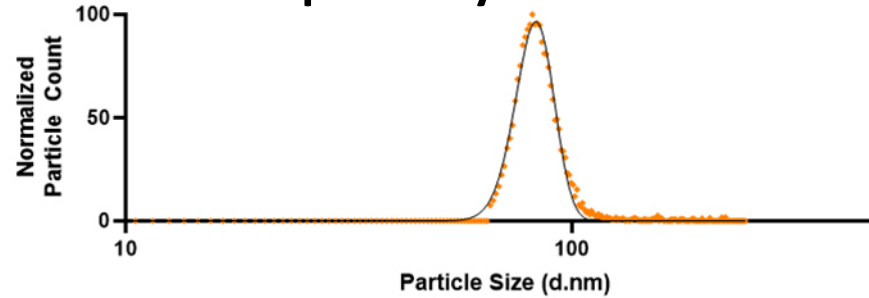


# Orthogonal Sizing Techniques

## Cryo-TEM (Number-Distribution)



## Microfluidic Resistive Pulse Sensing (Volume Distribution) Spectradyne nCS1



## DLS (Cumulant, Intensity-Based)

**Z-average** = 83.9 d.nm  
**PDI<sub>633</sub>** = 0.029

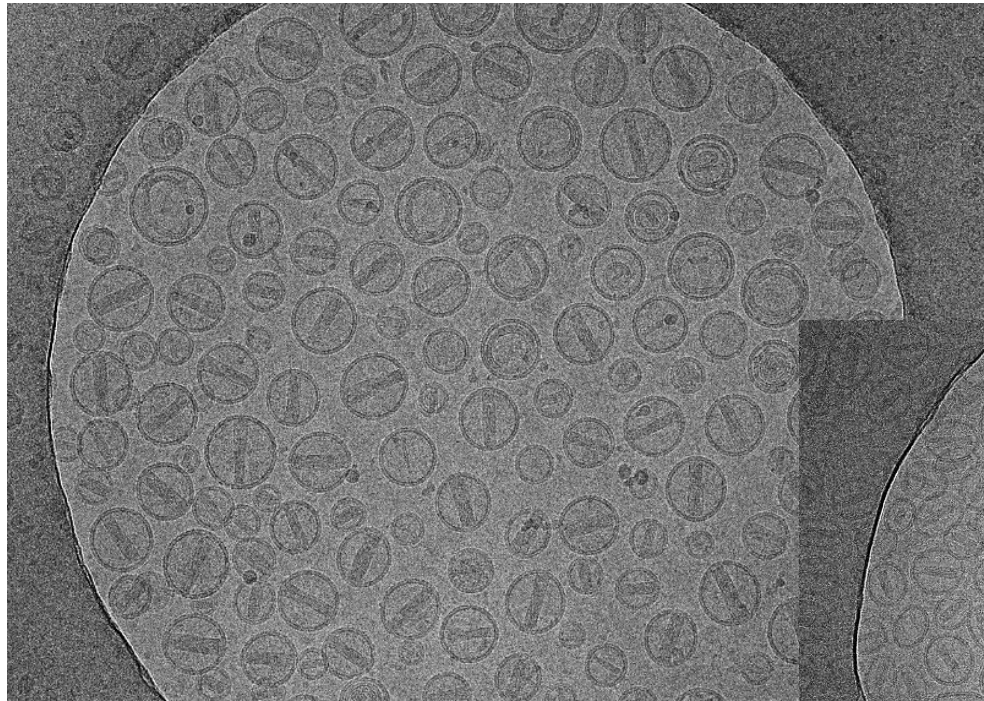
**Z-average** = 84.6 d.nm  
**PDI<sub>633</sub>** = 0.064

**Z-average** = 124.9 d.nm  
**PDI<sub>633</sub>** = 0.029

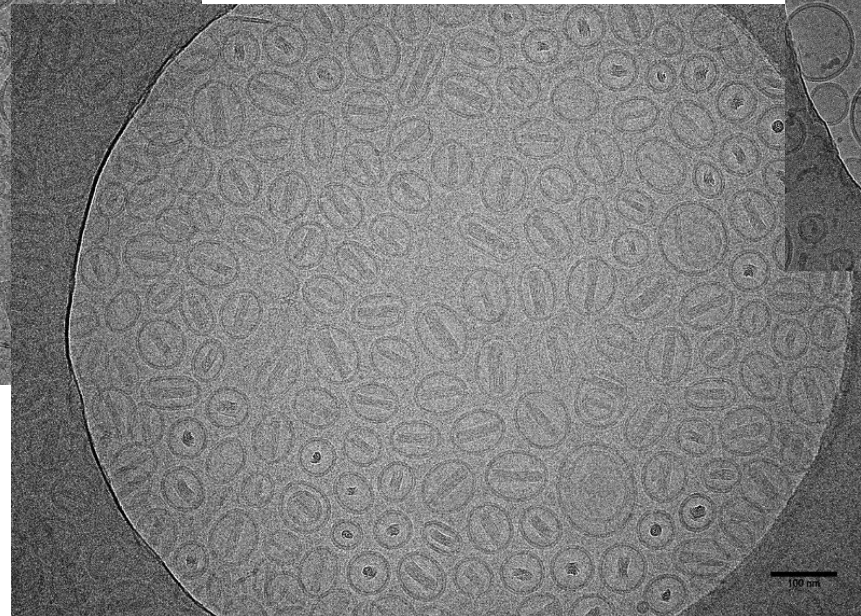


# Particle Size: Polydispersity and Wavelength

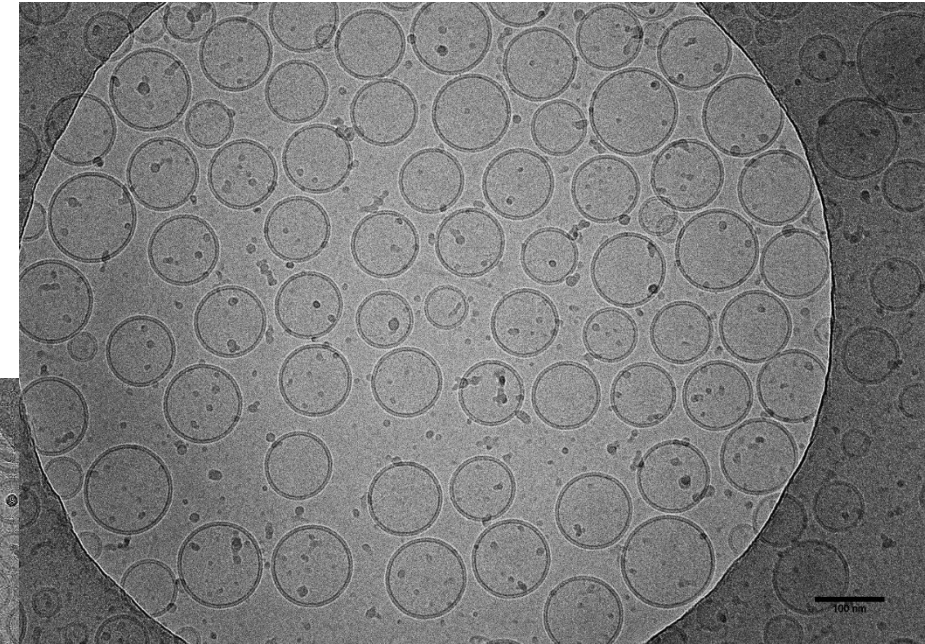
**PDI<sub>633</sub> = 0.064**  
**PDI<sub>1300</sub> = 0.107**



**PDI<sub>633</sub> = 0.029**  
**PDI<sub>1300</sub> = 0.147**



**PDI<sub>633</sub> = 0.039**  
**PDI<sub>1300</sub> = 0.008**



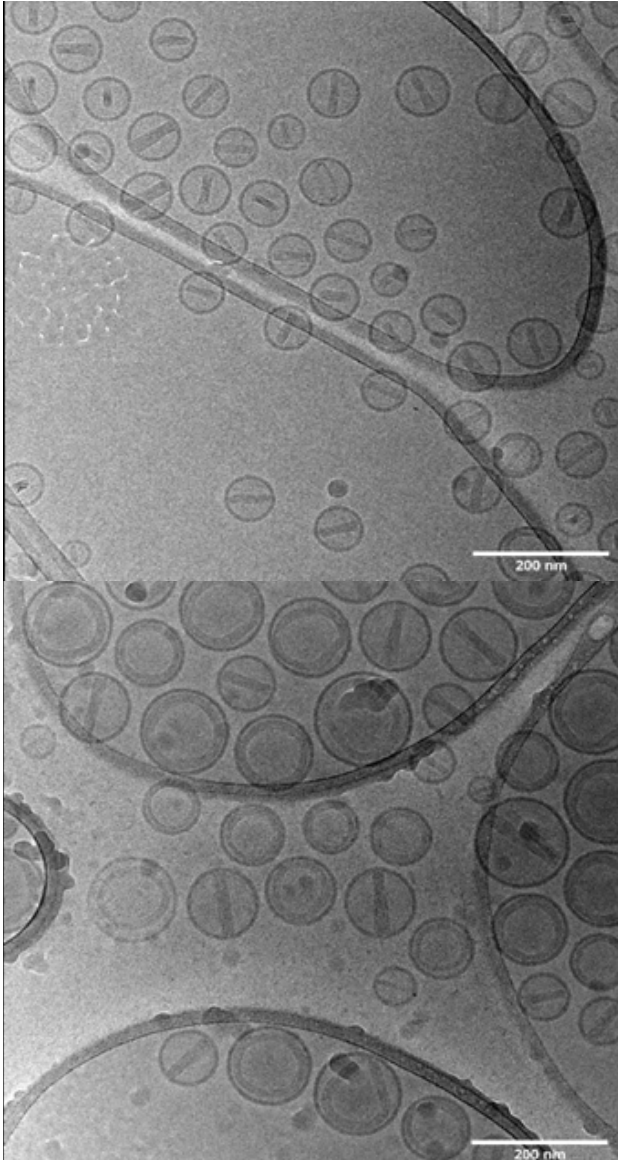
Size impacts on  
clinical adverse  
events?

Should a Cumulant  
PDI  $\geq 0.10$  be acceptable  
for nanoparticles?

# Liposomal Doxorubicin In-Vivo Study

In collaboration with: Nanotechnology  
Characterization Laboratory, Frederick National  
Laboratory for Cancer Research

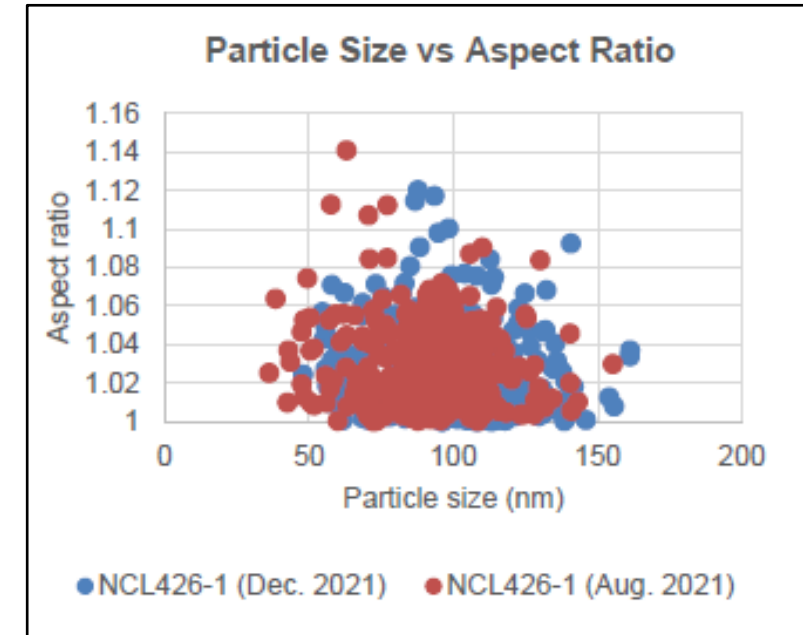
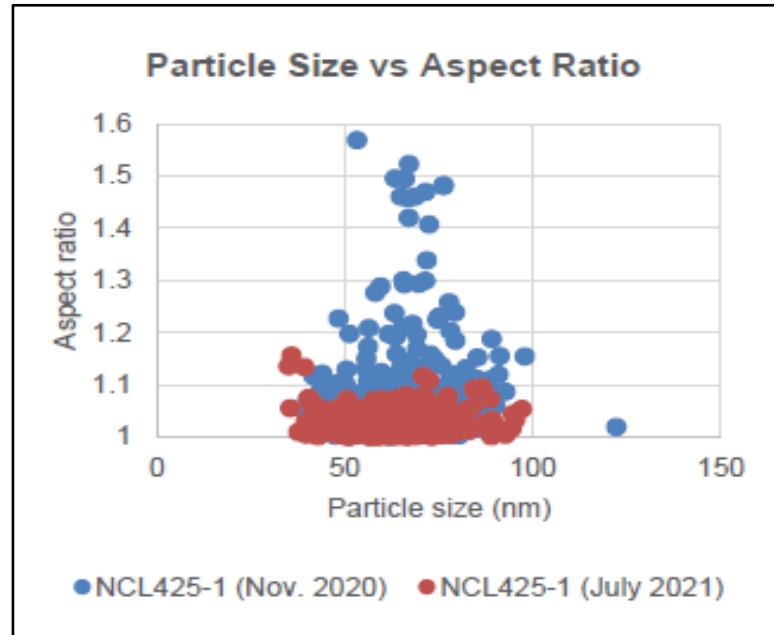
# Particle Characterization



NCL425

NCL426

Sample	Avg Diameter (nm)	Aspect Ratio	Linear Crystals (%)	Circular Crystals (%)
NCL425	66.5 ± 11.8	1.09 ± 0.10	86	10
NCL426	102.6 ± 21.1	1.02 ± 0.02	42	52



# Particle Size Characterization

## Hydrodynamic Size/Size Distribution using Dynamic Light Scattering

Sample	Dilution		Z-Avg (d.nm)	Int. Peak (nm)	PDI
NCL425	10 mM NaCl	100x	87.6 ± 0.6	91.3 ± 0.6	0.016 ± 0.011
		1000x	87.5 ± 0.05	91.2 ± 0.5	0.014 ± 0.006
	PBS	100x	87.3 ± 0.5	90.9 ± 0.5	0.013 ± 0.009
		1000x	87.5 ± 0.4	91.2 ± 0.5	0.018 ± 0.012
NCL426	10 mM NaCl	100x	119.5 ± 0.7	124.4 ± 0.5	0.016 ± 0.011
		1000x	119.7 ± 0.7	124.8 ± 0.7	0.015 ± 0.011
	PBS	100x	117.7 ± 0.8	123.9 ± 0.8	0.031 ± 0.017
		1000x	118.0 ± 0.6	124.7 ± 1.1	0.039 ± 0.008

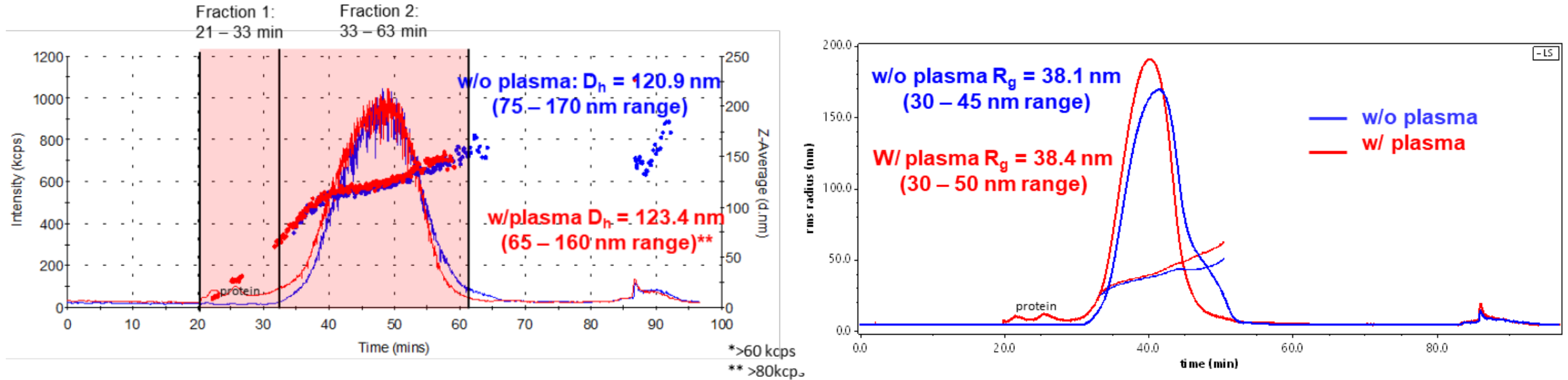
Z-Avg: intensity-weighted average. PDI: polydispersity index. Int. Peak: intensity-weighted average over the primary peak.

- NCL425 exhibited an average size of approximately 90 nm, while NCL426 had a larger size of approximately 125 nm
- The size of a well-known manufactured drug product, previously measured at approximately 90 nm, aligns with NCL425



# Formulation Stability: NCL-426

## AF4 separation with in-line MALS and DLS



$\rho = R_g/D_h$ , where  $\rho$  = shape factor

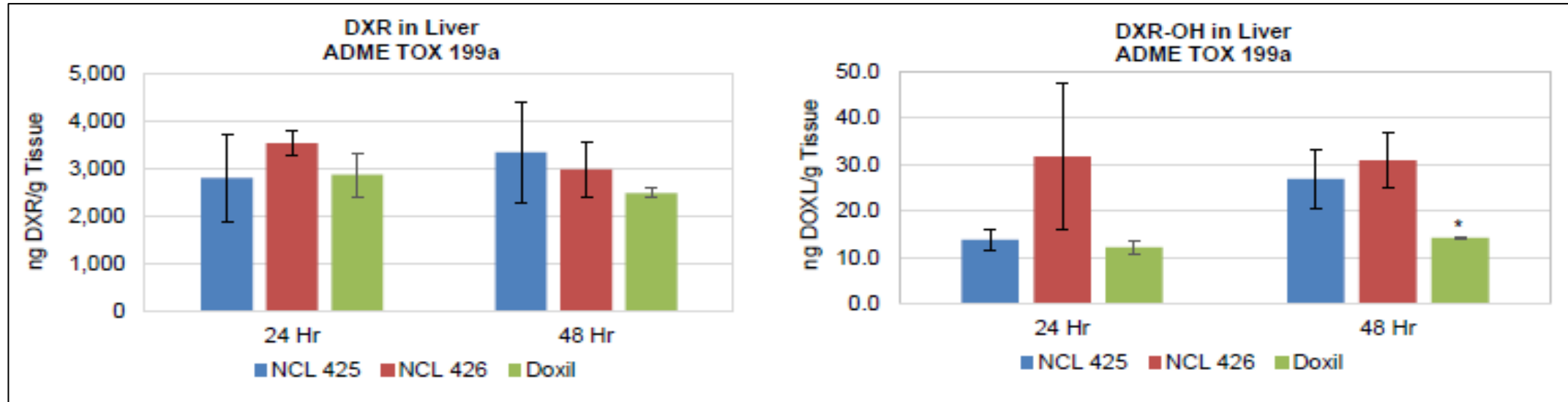
$$\rho_{\text{NCL426}} = 1.09$$

$$\rho_{\text{plasma}} = 1.11$$

$$\rho_{\text{Uniform sphere}} = 0.78$$

Minimal shift in  $\rho$ , suggesting minimal protein binding, consistent with manufactured drug product

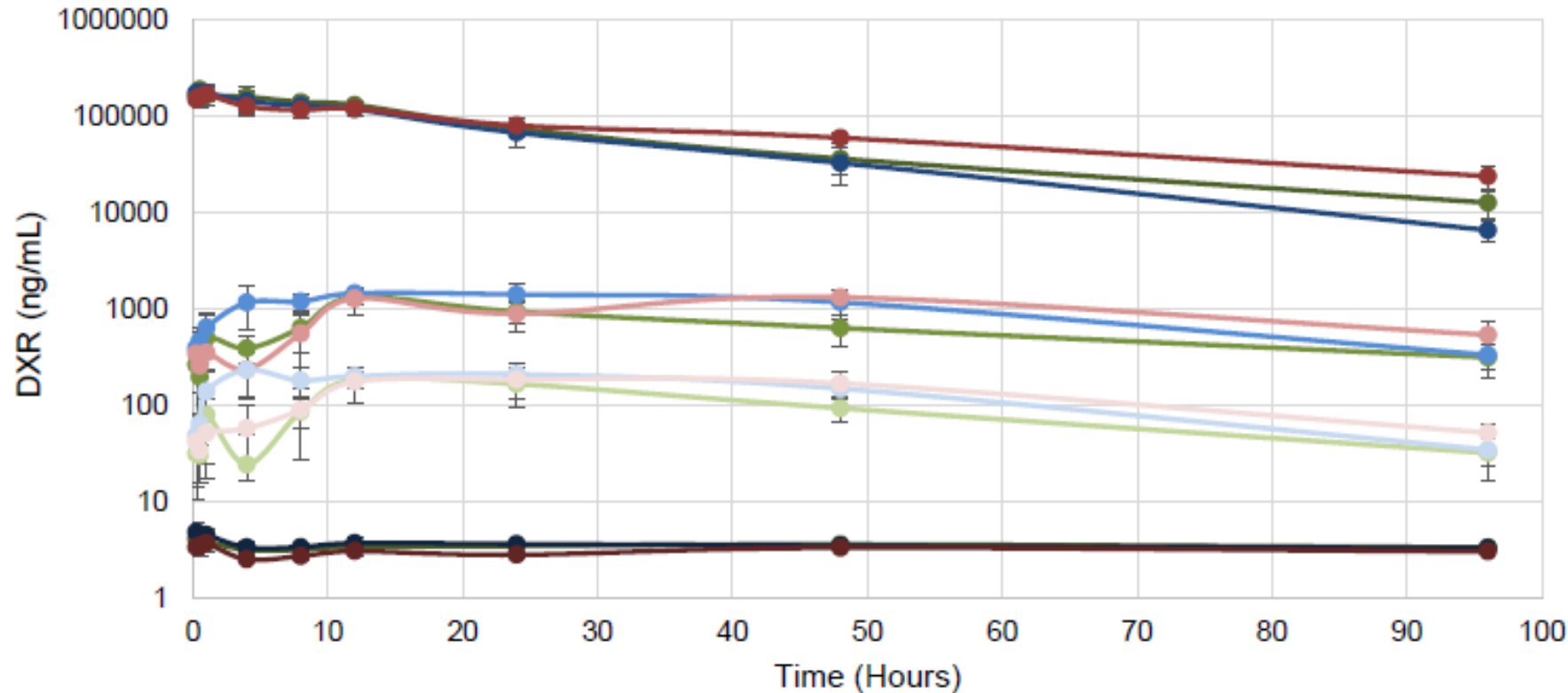
# Toxicity Evaluation



- Doxorubicin accumulation (left), and doxorubicinol accumulation (right) in the liver (Mean  $\pm$  SD, N=3).  
\*NCL426 vs. Mfd. Drug,  $p < 0.05$ , ANOVA with Tukey's post-hoc comparisons
- Doxorubicin accumulation in the heart, liver, and ear tissue was comparable among NCL425, NCL426, and manufactured drug product.
- Statistically significant differences were found in doxorubicinol concentrations in the heart and liver, indicating slight variations in tissue concentration profiles.

# Bioequivalence: In Vivo Drug Release

Total, Unencapsulated, and Unbound DXR and Doxorubicinol



NCL425, NCL426, and manufactured drug product, total, unencapsulated and unbound drug profiles were similar in vivo.

- NCL 425 Total
- NCL 425 Unencapsulated
- NCL 425 Unbound
- NCL 425 Doxorubicinol
- NCL 426 Total
- NCL 426 unencapsulated
- NCL 426 Unbound
- NCL 426 Doxorubicinol
- Doxil Total
- Doxil Unencapsulated
- Doxil Unbound
- Doxil Doxorubicinol

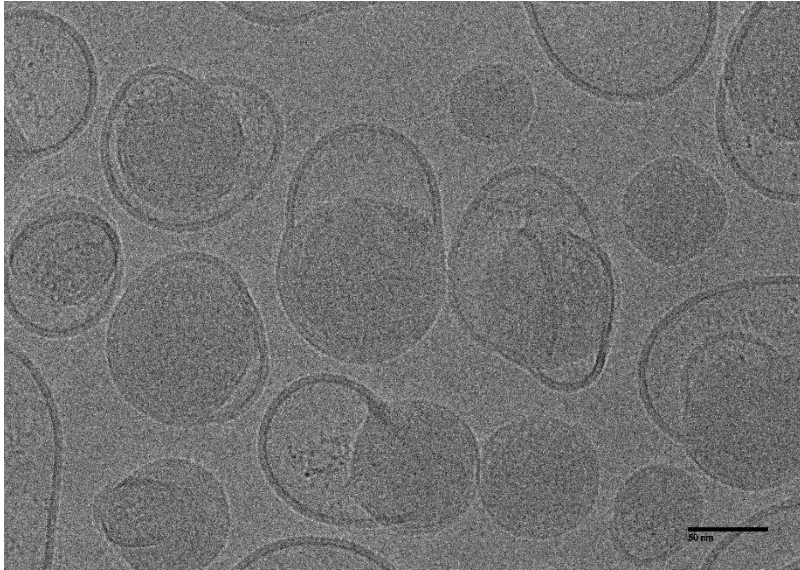
# mRNA-LNPs

## Structural Properties



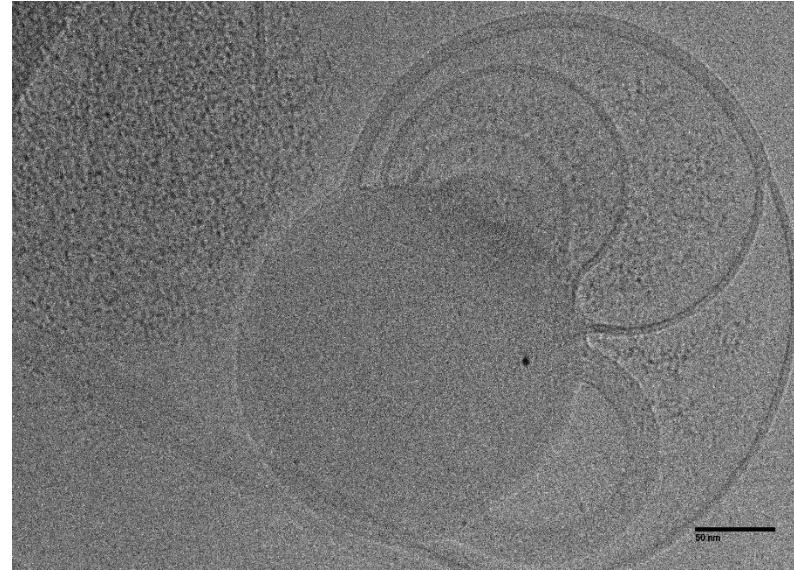
# mRNA-LNPs and formulation stability

**Low Phase Transition Lipid ,  
1.7% EtOH**



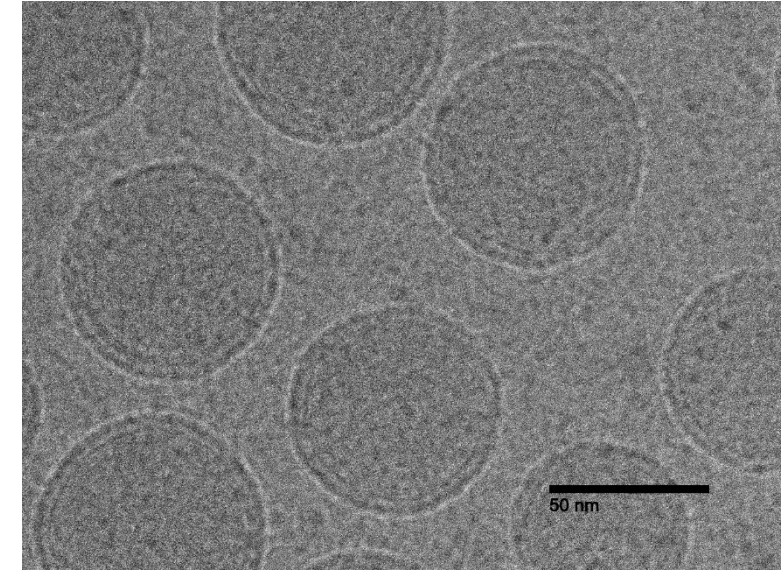
**Bleb-like structure  
Possible mRNA separation into  
multiple compartments**

**Low Phase Transition Lipid ,  
5.0% EtOH**



**Bleb-like structure, swelling,  
lamella extended  
Possible mRNA separation into  
multiple compartments**

**Higher phase transition lipids,  
ethanol <0.5%**

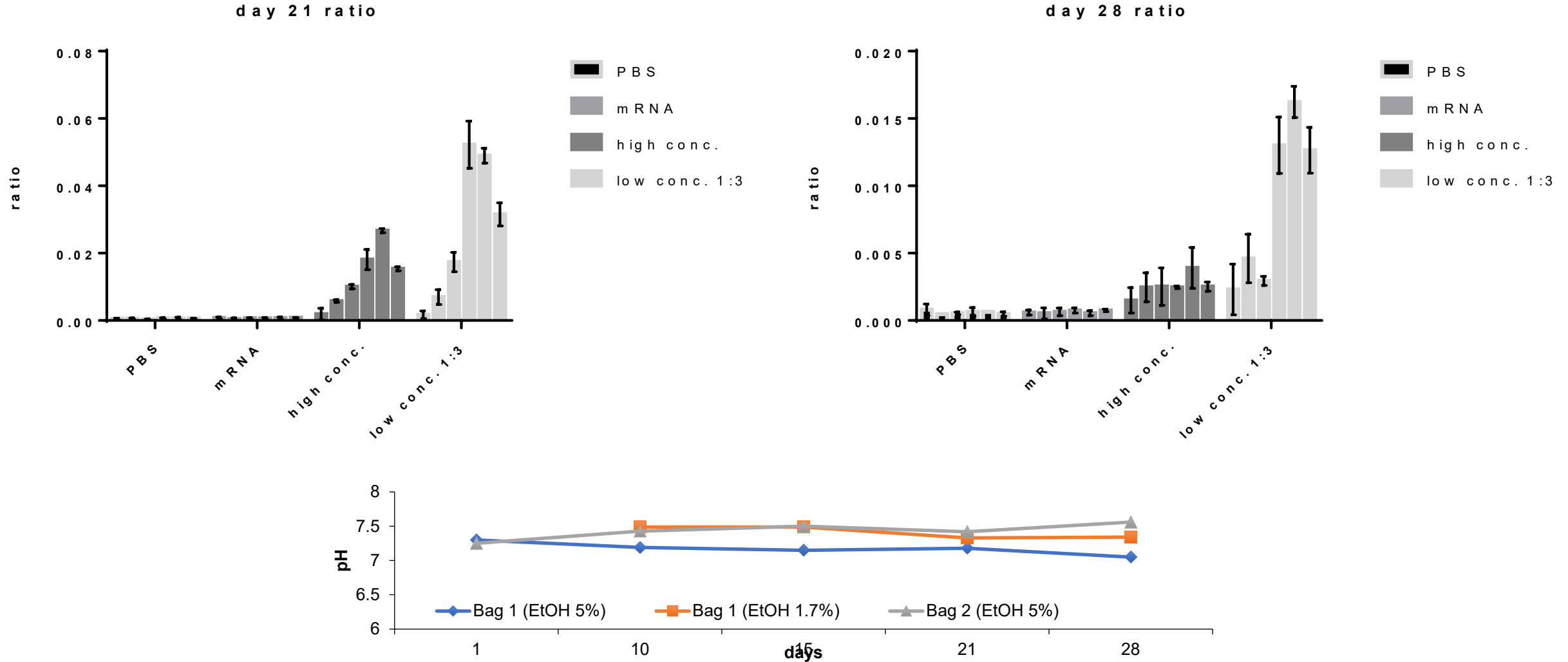


**Solid-core and no separation,  
more stable structure**

# mRNA LNP Transfection, 28 days

Particles: SSOP-POPE-Cholesterol-GM-PEG2k

Cell line: K562, Chronic Myelogenous Leukemia Cells



# Computational Fluid Dynamics and Molecular Dynamics (CG-MD)

*Work performed by Dr. Bodhi Chaudhuri's Lab*

**molecular pharmaceuticals**  
pubs.acs.org/molecularpharmaceutics

**Coarse-Grained Molecular Dynamics Simulations of Paclitaxel-Loaded Polymeric Micelles**

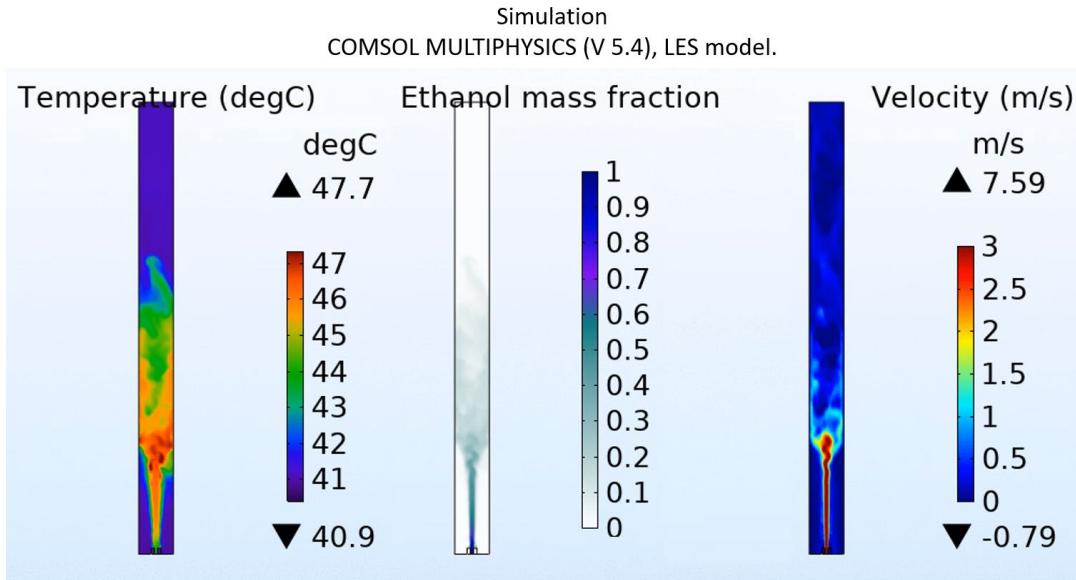
Tibo Duran, Antonio Costa, Anand Gupta, Xiaoming Xu, Hailing Zhang, Diane Burgess, and Bodhisattwa Chaudhuri\*

[Cite This: https://doi.org/10.1021/acs.molpharmaceut.1c00800](https://doi.org/10.1021/acs.molpharmaceut.1c00800) [Read Online](#) [Supporting Information](#)

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**ABSTRACT:** A continuous manufacturing technology based on coaxial turbulent jet in coflow was previously developed to produce paclitaxel-loaded polymeric micelles. Herein, coarse-grained molecular dynamics (CG-MD) simulations were implemented to better understand the effect of the material attributes (i.e., the drug-polymer ratio and the ethanol concentration) and process parameters (i.e., temperature) on the self-assembly process of polymeric micelles as well as to provide molecular details on micelle instability. An all-atom (AA) poly(ethylene glycol)-poly(lactic acid) (PEG-PLA) polymer model was developed as the reference for parameterizing a coarse-grained (CG) model, and the AA polymer model was further validated with experimental glass

# CFD Jet-flow Studies



## Eddy Current Analysis (Below)

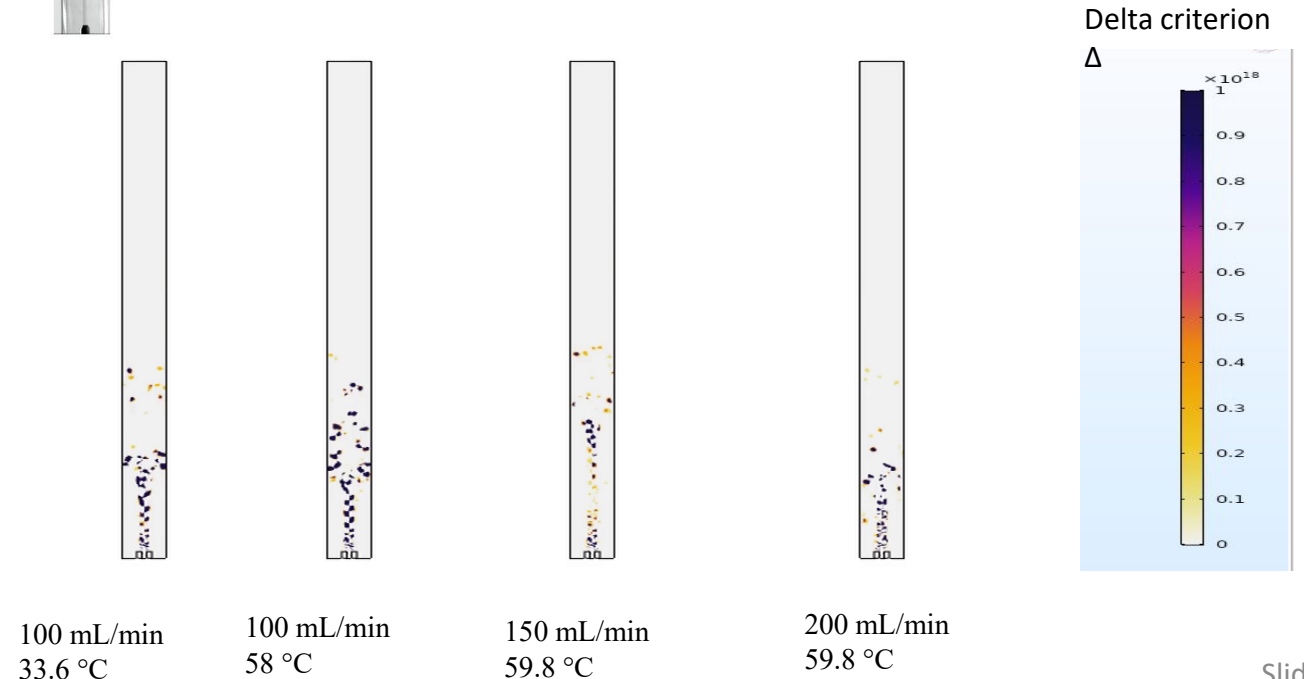
Delta criterion defines vortices as regions in the value of delta is greater than 0.

$$\Delta = \frac{Q^3}{27} + \frac{R^2}{4} > 0$$

$\Omega_{ij}$ : rotation rate tensor

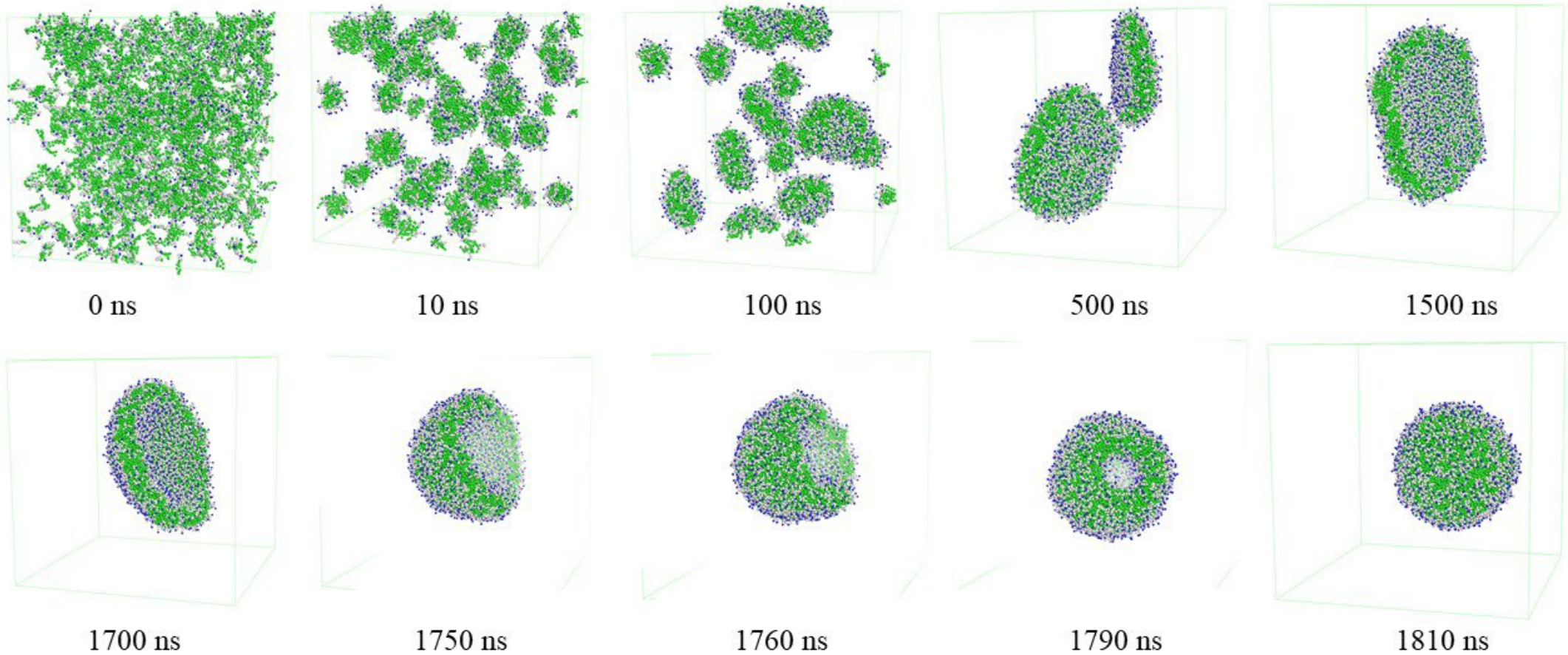
$S_{ij}$ : strain rate tensor

Simulations provide additional information that is not measurable or difficult to measure.



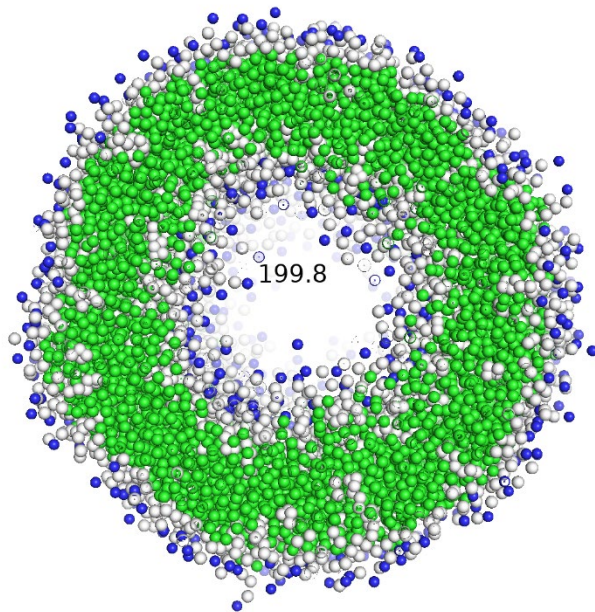
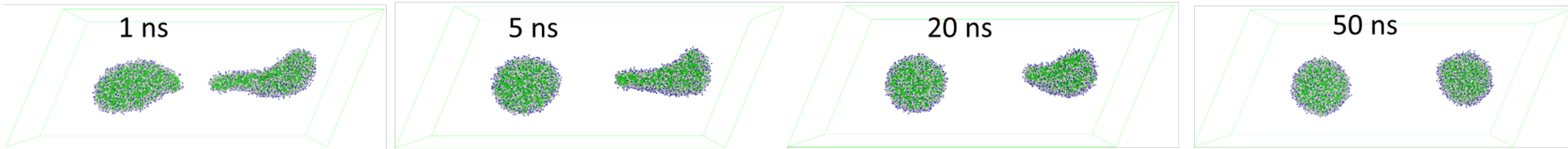


# MD Liposome Formation Studies

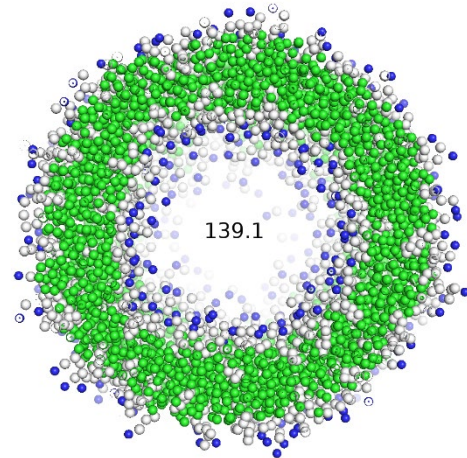


Simulation temperature: 333 K

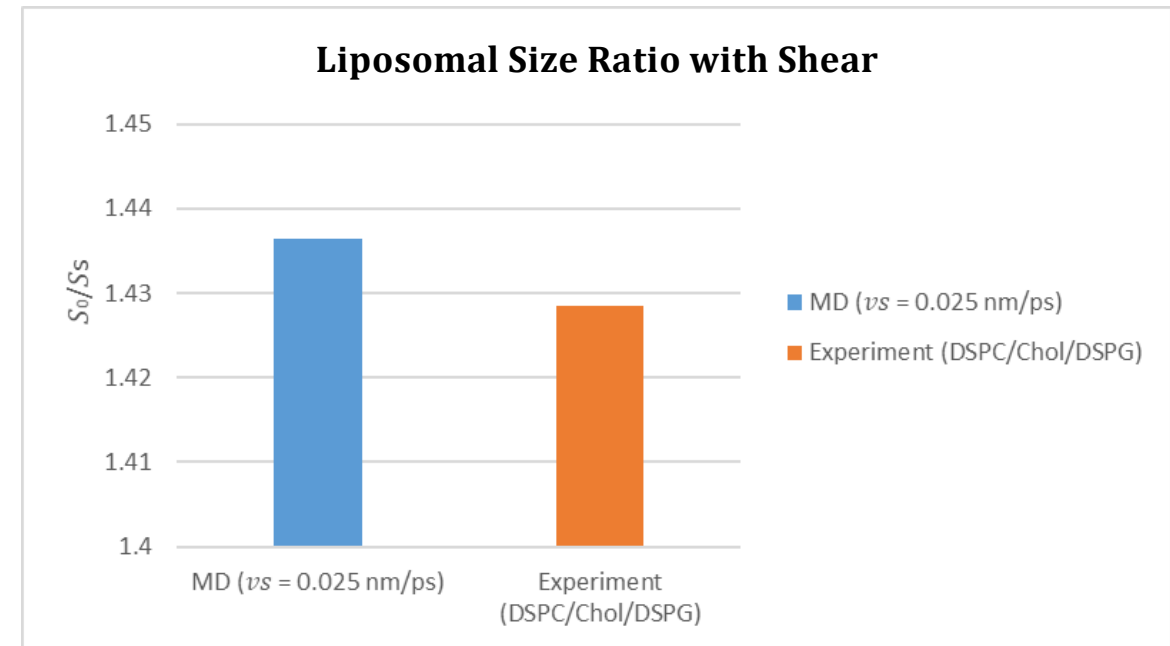
# Shear Simulations (Case $v_s = 0.025$ nm/ps)



Before shear (19.98 nm)



After shear (13.91 nm)



Liposome size ratio	Molecular Dynamics simulation results	Experiment results
$S_0/S_s$	1.436	1.428

- Higher shear rates resulted in smaller liposome formation
- MD issue is actual particle size due to constraints

$$S_0 = \text{liposome size before shear}$$

$$S_s = \text{liposome size after shear}$$

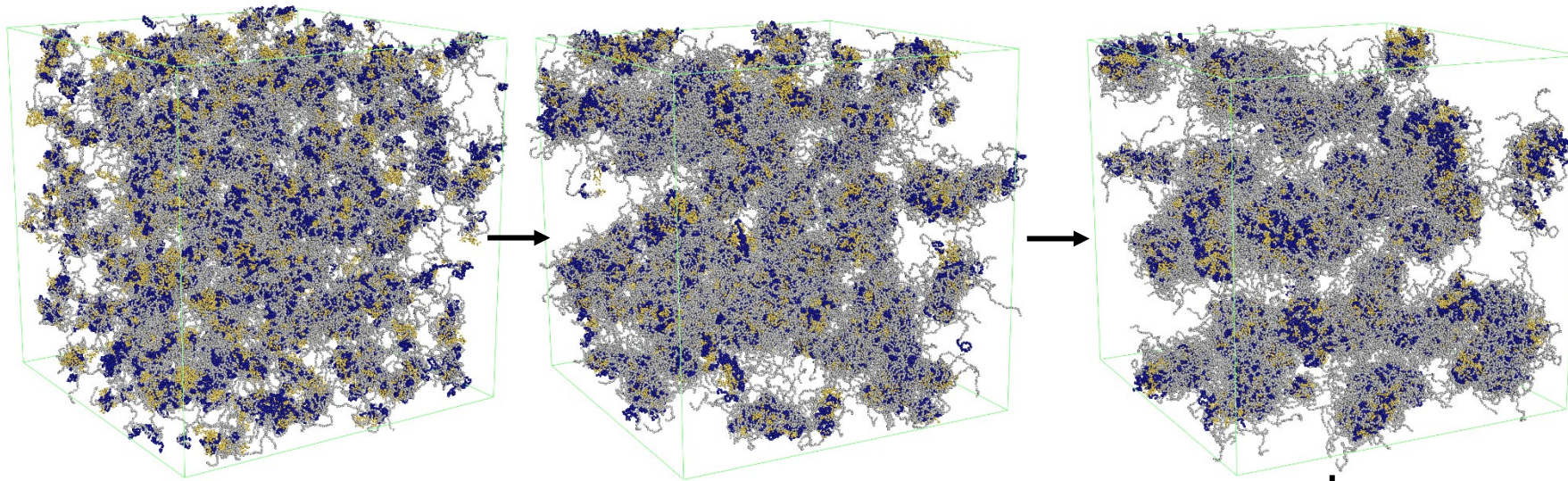


# Paclitaxel PEG-PLA Micelle Formation

(a) 10 ns

(b) 50 ns

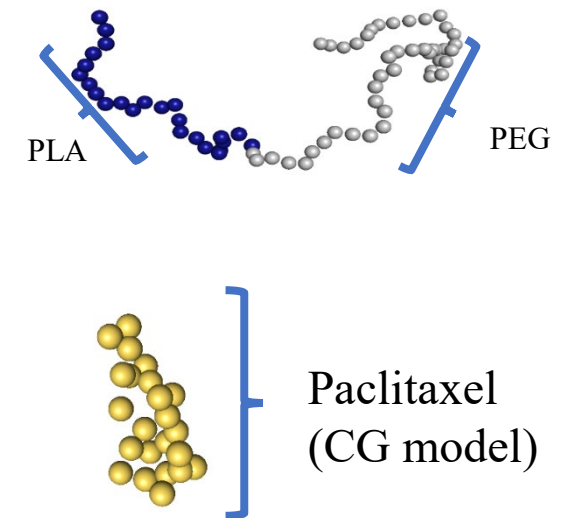
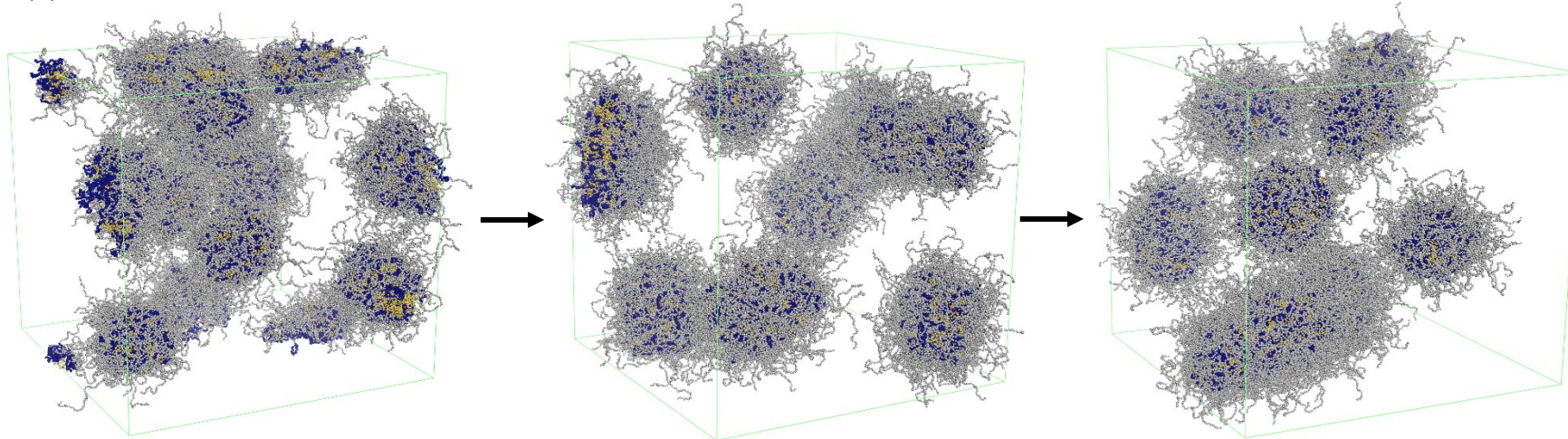
(c) 100 ns



(d) 1000 ns

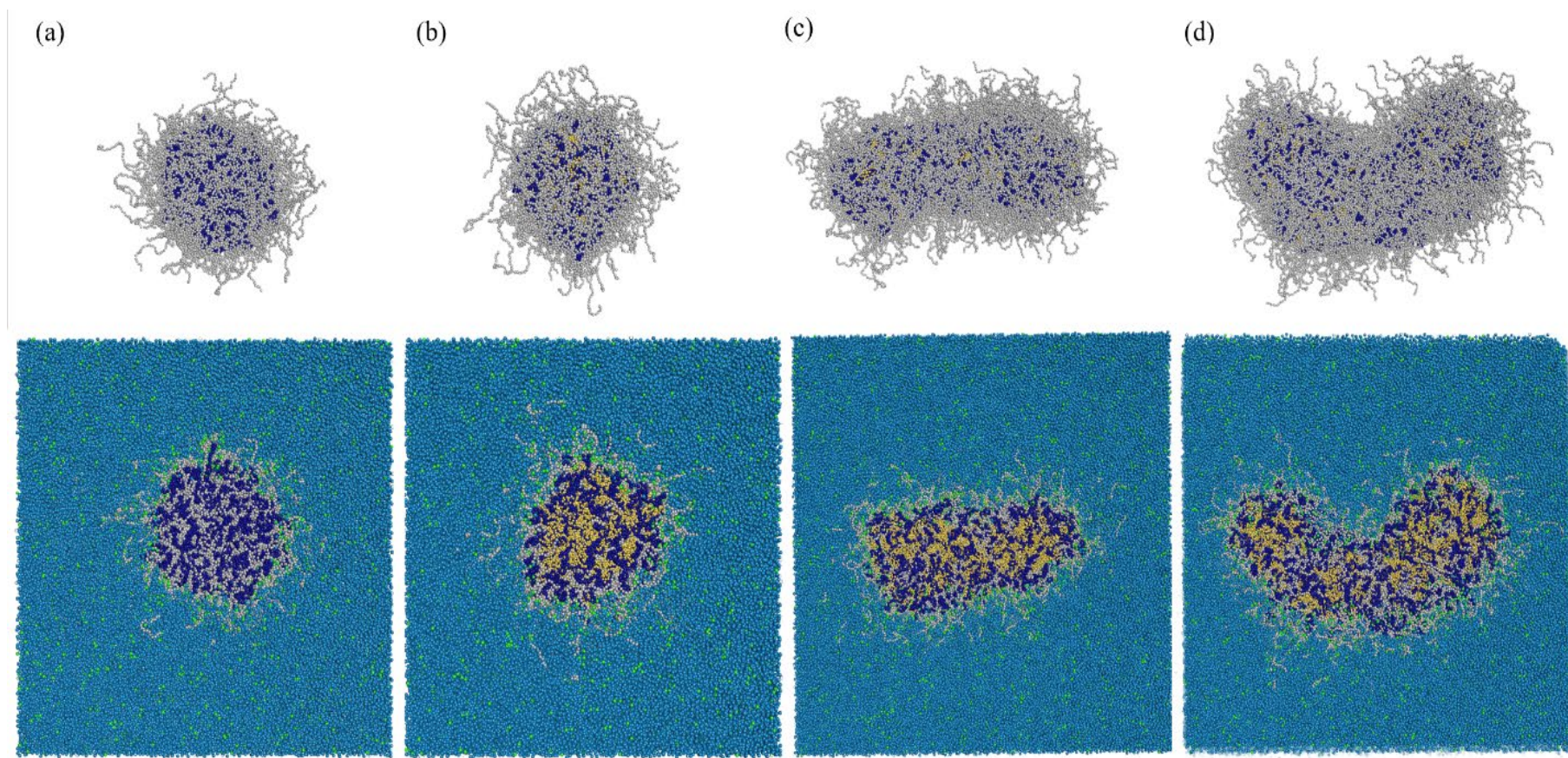
(e) 1500 ns

(f) 2000 ns





# Polymeric Micelle Structures

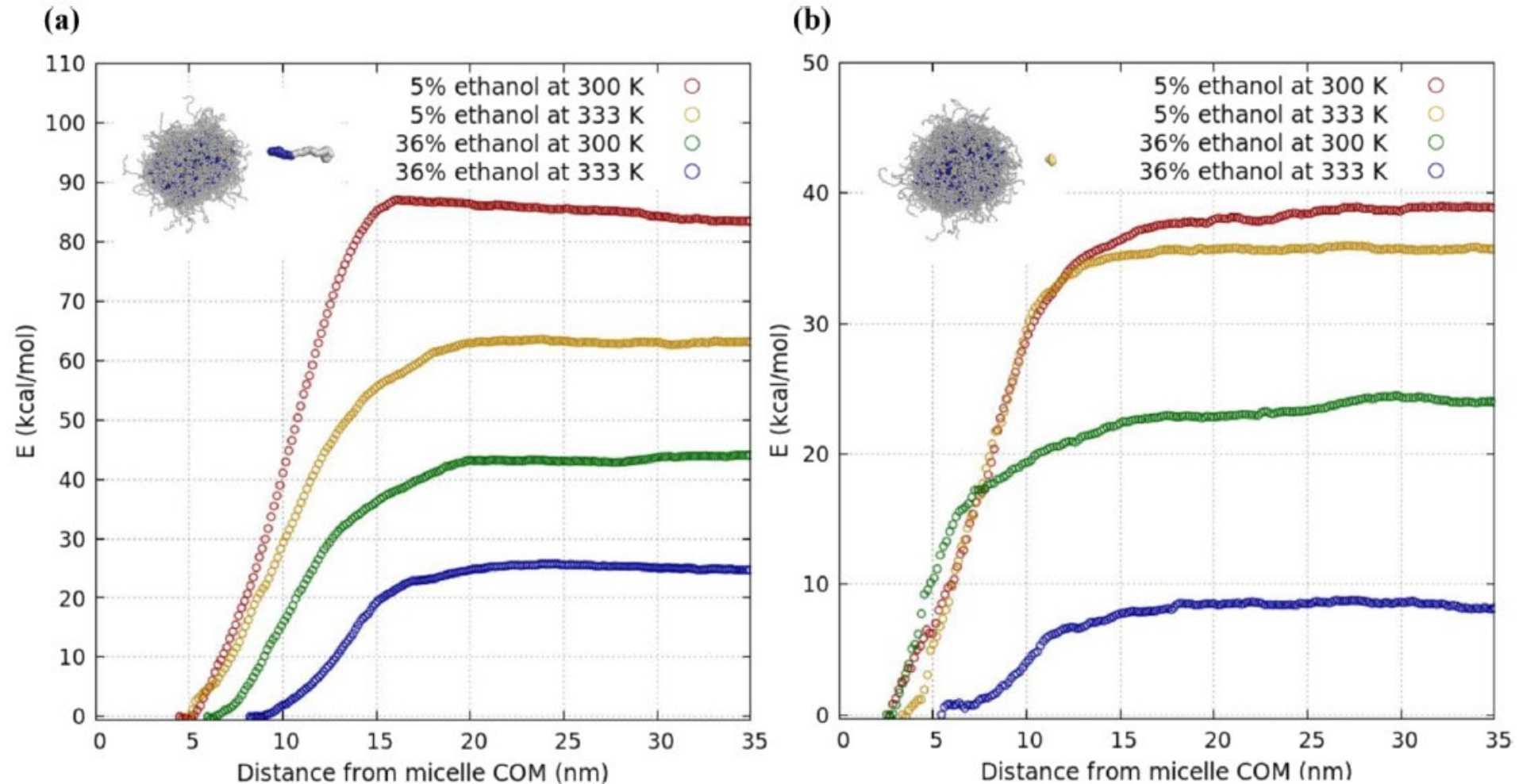


(a) blank spherical structures, (b) drug-loaded spherical structures, (c) drug-loaded rod-like structure, (d) drug-loaded worm-like structure

● PLA beads, ● PEG beads, ● PTX beads, ● water beads, and ● ethanol beads

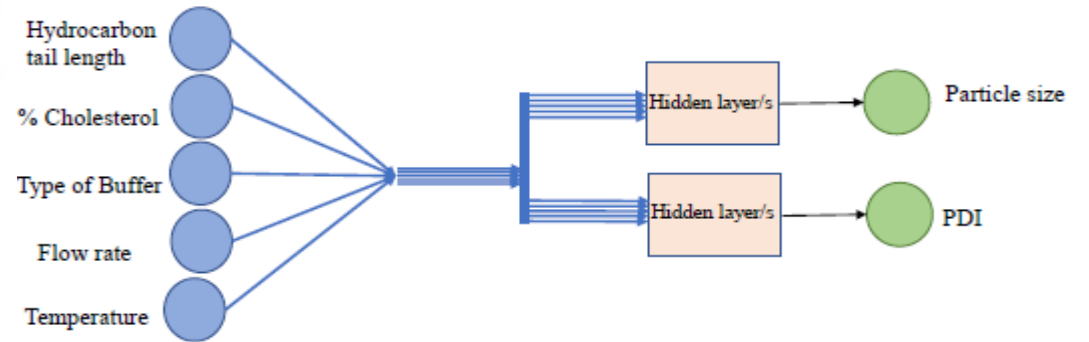
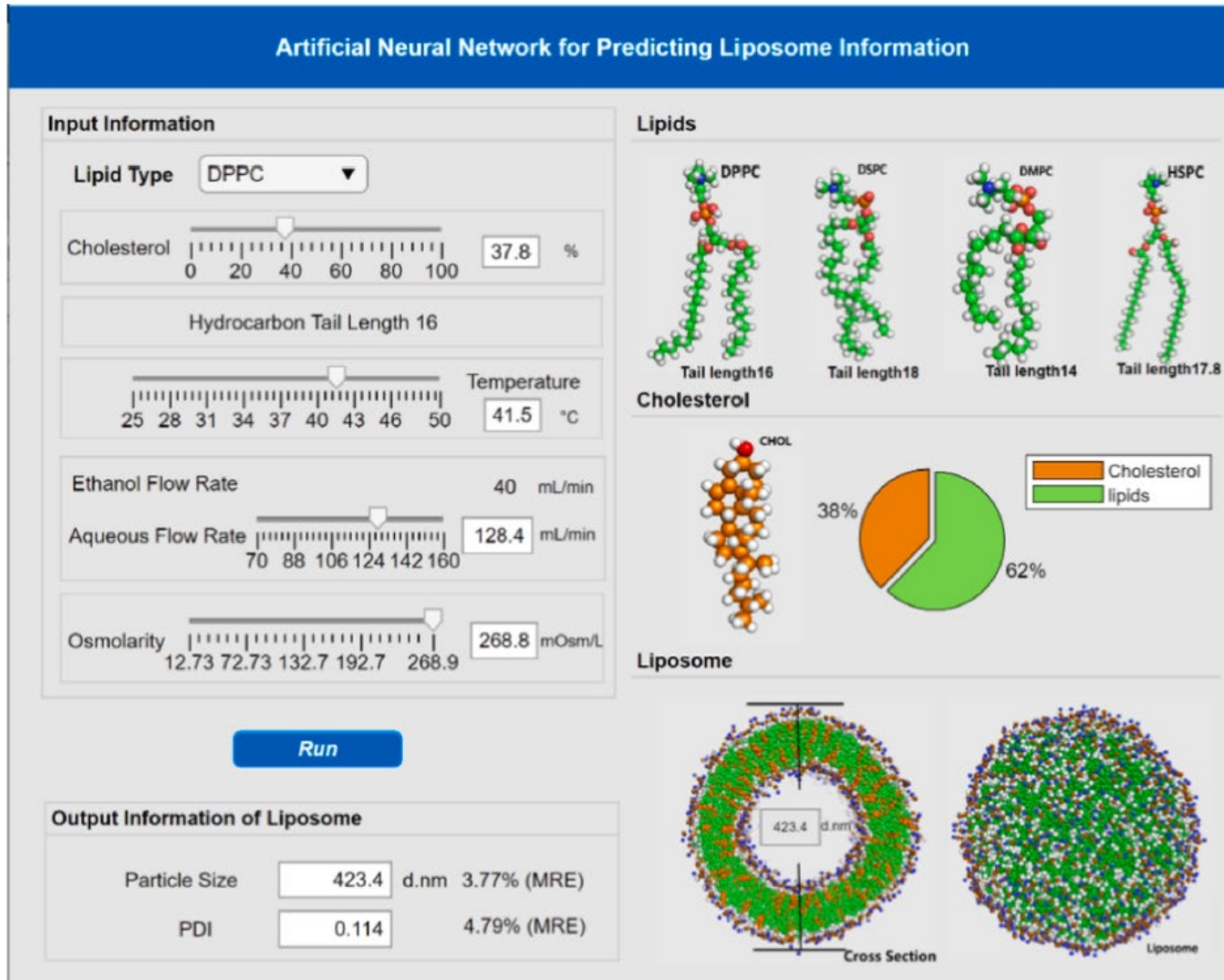


# Free Energy of Polymeric Micelle Dissociation

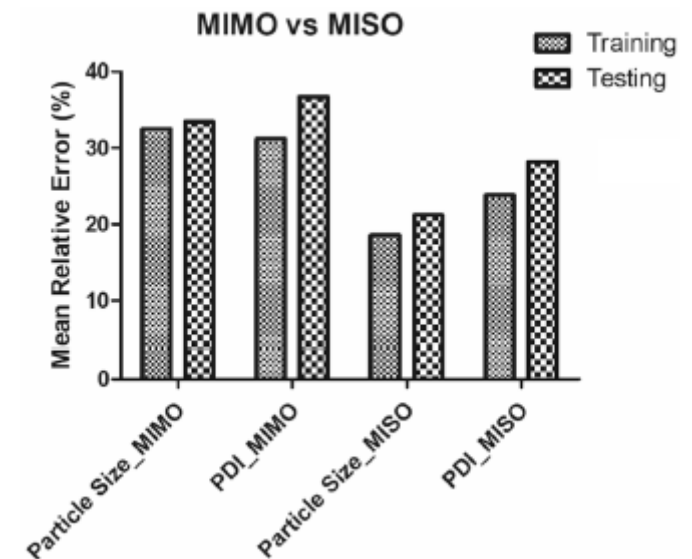


Potentials of the mean force calculated along the reaction coordinates for (a) pulling single PEG-PLA and (b) pulling single paclitaxel molecules away from the COM of the rest of the aggregate.

# Artificial neural networks for continuous manufacturing



Compared multi-input multi-output model (MIMO) and multi-input single-output model (MISO) models. MIMO vs MISO for predicting liposome particle size and PDI.



# Thank you!

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- U01FD006975: Continuous Manufacturing of Nanoparticles: Establishing Real-Time-Release Testing Methods for a GMP-Ready System and Evaluation of Liposomal Morphological Changes in Real-Time (2020-2022)