# Liquid Liquid Phase Separation and Fibrillization of Intrinsically Disordered Peptides



Joan Shea, Department of Chemistry, UC Santa Barbara

# Proteins can assemble in different ways



### "Solid"



Droplets Biomolecular condensates Coacervates

**Amyloid Fibrils** 

# Outline

## Part 1: Liquid-Liquid Phase Separation: From Model Systems to Tau

# Part 2: Aggregation of the Tau Protein





Coacervation = liquid liquid phase separation = formation of droplets = formation of biomolecular condensates





Liquid condensate

Solid condensate

# What drives phase separation?



Brangwynne, Tompa, Pappu, Nature Physics, 11, (2015)

# **Computational Approaches**



# **Computational Approach**



Dilute conditions

# **Computational Approaches**



# Model System: EK sequence





net charge = 0

(equal fractions of + and -)

# **Simple Coacervation**



# **Coarse-Grained Model**

### **Coarse-grained peptide chain**

Each amino acid represented by a single site



### **Implicit solvent**

**Explicit salt ions** 



## **Discrete Gaussian chain polyelectrolyte model**



charge sequence

 $N_l$  sites per molecule

$$\{\sigma_i\}=\{\sigma_1,\sigma_2,\ldots,\sigma_N\}$$

charge density

$$rac{1}{N}\sum_i |\sigma_i|$$

- $\sigma_i\;$  charge on bead i
- $b_{}$  segment length



# **Formally equivalent representations**



# Field Theoretic simulation

low polymer density

high polymer density



# **Particle Based Simulations**

SCD  $\kappa$ 





**James Mc Carthy** 



# **Particle Based Simulations**

### 



### **Particle Based versus Field Theoretic Simulations**



J. Phys. Chem. Lett., 2019, 10 (8), pp 1894–1899

### We map the boundaries of the phase diagram



### "Blocky" sequences form coacervates more readily



### Increasing the salt concentration favors a single phase



# **Computational Approach**



### Limitations

- No amino acid specificity
- Implicit solvent

# Upper (UCST) and Lower (LCST) critical solution temperature



Mittag, Biochemistry. 2018; 57(17): 2478–2487.

# **Computational Approach**



# OLD: Model System: KE (Lys/Glu)sequence

- NEW: Model System: RE(Arg/Glu)sequence RE1: Poly-Arg/Glu RE2: Poly-Arg/Glu 0000000000000000 RE3: Poly-Arg/Glu •••••••••• RE4: Poly-Arg/Glu 0000000000

### All atom replica exchange MD reference simulations

Arg

HO

-NH

NH,

NH

€NH,

Glu

MO

0=

 $H_2N$ -

 $\mathbf{O} =$ 

**O**=

Θ



### **Relative Entropy Coarse-graining**

Minimizing the relative entropy:

$$S_{rel} = \int \int \mathscr{D}_{AA}(\mathbf{r}) \ln\left(\frac{\mathscr{D}_{AA}(\mathbf{r})}{\mathscr{D}_{CG}(\mathbf{R})}\right) \delta(\mathbf{M}(\mathbf{r}) - \mathbf{R}) d\mathbf{r} d\mathbf{R}$$

27



## **Relative Entropy Parameterization**



## **RE** peptides phase behavior



## **RE** peptides phase behavior

RE1: Poly-Arg/Glu RE2: Poly-Arg/Glu RE3: Poly-Arg/Glu RE4: Poly-Arg/Glu



# Tau Protein Liquid Liquid Phase Separation and Fibrillization



### **MICROTUBULES ARE STABILIZED BY TAU PROTEINS**



# Function: Tau binding to microtubule

# Microtubule Pathology:Tau and Aggregation





### Liquid-Liquid Phase Separation of Tau and Fibril Formation



Image: S. Wegmann



# Field Theory Modeling of Tau-RNA complex coacervation



Fit excluded volume (B) and Bjerrum length (E) to experimental values for Tau
### Field Theory can map out the entire phase diagram of Tau-RNA Complex Coacervation



### Field Theory can map out the entire phase diagram of Tau-RNA Complex Coacervation



### Tau sequence: The Proline-Rich Domain Liquid-Liquid Phase Separates in vitro



# The Proline-Rich Domain Condensates promote Tau association with MTs

197





PRD condensates align along the MTs

### MICROTUBULES ARE STABILIZED BY TAU PROTEINS



### LLPS CONCENTRATES TAU AND FACILITATES BINDING

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#### "Solid"



Droplets Biomolecular condensates Coacervates

**Amyloid Fibrils** 

### Tau Aggregation: Repeat Domain makes up the core of Tau Fibrils

197



## There are many neurodegenerative diseases associated with Tau



### There are many forms of Tau



### At first glance they all look the same

### Transmission Emission Microscopy (TEM)



### X-Ray diffraction



#### Cross-beta structure

#### **Fibrils**

### But Cryo-EM shows (subtle) differences



### The specific fibril shape is a signature of a specific disease



### COMMON STRAND-LOOP-STRAND MOTIF





### Created: 19 Amino-acid Peptide



### WILD TYPE: jR2R3



### jR2R3-P301L mutant aggregates faster than jR2R3 and shows more fibril morphologies

### jR2R3

### jR2R3-P301L



### jR2R3-P301L can explore more conformational space



#### jR2R3-P301L (mutant)



### jR2R3-P301L can get out of a "fibril protective" hairpin iR2R3 jR2R3-P301L (mutant)



Overhauser Dynamic Nuclear Polarization (ODNP) experiments show a reduction in hydration water dynamics around 301 site for the  $P \rightarrow L$  mutant (jR2R3-P301L)





Increased ordering of water around mutation site

→ locally more hydrophobic

### Probing Hydrophobicity Computationally through Umbrella Sampling (INDUS)

Free energy of dewetting a spherical volume in bulk

 $\mu_{\mathbf{ex}} = \mathbf{F}(\mathbf{0}) = -\mathbf{ln}\mathbf{P}_{\mathbf{v}}(\mathbf{0})$ 



### Free energy of dewetting the probe volume in vicinity of a surface

Excess chemical potential is an indication of hydrophilicity or hydrophobicity of the surface



### Free energy of dewetting lower for jR2R3-P301L: an additional factor favoring association of jR2R3-P301L



### Quantifying Water Structure: water triplet distribution



### Increased tetrahedral ordering of hydration waters near the L301 (mutant) compared to P301 (wild type)



#### **Different Force Fields Show Different Hydrophobicity**



### "fibril protective structure"







1054

5305

### Recent CryoEM structure of jR2R3-P301L



В





Professor Songi Han UCSB/ Northwestern University



### CryoEM structure of jR2R3-P301L







### jR2R3-P301L can seed the fibrillization of full length Tau in Vivo



### jR2R3-P301L can seed the fibrillization of full length Tau in Vivo

### Before jR2R3 P301L



Prof. Ken Kosik, UCSB



#### After jR2R3 P301L





### jR2R3-P301L acts as a prion: propagates the strain



PNAS (2024) 121 (15) e2320456121

Cells seeded with jR2R3-P301L fibrils undergo division and propagate aggregates to daughter cells



Back-up Slides
## **Determining Critical Points**

diblock E = 6.0 B = 0.1



Mechanical (Pressure  $\Pi$ ) and Chemical (Chemical Potential  $\mu$ ) Equilibrium

## **Determining Critical Points**

diblock E = 6.0 B = 0.1



## We map the boundaries of the phase diagram



## **Field Theoretic Model**

Partition function for a system of charged Gaussian chains and salt in implicit solvent

$$Z=Z_0\int Dw\int D\psi\;e^{-H[w,\psi]}$$



### **B: dimensionless excluded volume parameter**

- E: dimensionless Bjerrum length
- **C: dimensionless monomer density**

## **Field Theoretic Simulations**

Complex Langevin equations of motion

Ensemble averages over the field configurations

$$\langle O 
angle = rac{\int Dw \int D\psi \ Oe^{-H[w,\psi]}}{\int Dw \int D\psi \ e^{-H[w,\psi]}}$$

## RE peptides phase behavior

RE4: Poly-Arg/Glu ••••••••••



## **Discrete Gaussian chain polyelectrolyte model**

dimensionless monomer density

$$C\sim
ho b^3$$

dimensionless excluded volume parameter

$$eta U = rac{v}{2} \int d{f r} ar 
ho^2({f r}) \qquad \qquad B \sim rac{v}{b^3}$$

dimensionless Bjerrum length

$$eta U = rac{l_B}{2} \int d\mathbf{r} \int d\mathbf{r}' rac{ar{
ho}_e(\mathbf{r}) ar{
ho}_e(\mathbf{r}')}{|\mathbf{r} - \mathbf{r}'|} \qquad E \sim rac{l_B}{b}$$

## Coarse graining though minimizing $S_{rel}$ (Information Loss)



### Chemical Detail & transferability

Minimizing the relative entropy (information-loss):

$$S_{rel} = \int \int \mathscr{D}_{AA}(\mathbf{r}) \, \ln\left(\frac{\mathscr{D}_{AA}(\mathbf{r})}{\mathscr{D}_{CG}(\mathbf{R})}\right) \delta(\mathbf{M}(\mathbf{r}) - \mathbf{R}) d\mathbf{r} \, d\mathbf{R}$$

Shell Adv. Chem. Phys.



## Field theoretic simulation water model



## MD coarse-grained water model



Match  $\epsilon = 80$  at 300 K

# Relative entropy parametrization of peptide and water interaction

RE1: Poly-Arg/Glu •••••••••••



 $\sigma = a_i = R_w = 0.158 \, nm$ 

- $\beta U_{bond,water}$ : stiff harmonic with b = 0.01 nm
- $\beta U_{bond,residue}$ : harmonic with  $b = \sqrt{6} \sigma$

• Electrostatics: 
$$\beta U_{el,W-,W+}$$
,  $\beta U_{el,W+,W+}$ ,  $\beta U_{el,W-,W-}$ 

• Excluded volumes:

• 
$$u_{W-,W-} = u_{Lys,Lys} = u_{Cl,Cl} = u_{W-,Cl} = u_{Lys,Cl} = 0.1 \, kT \, \sigma^3$$

•  $u_{W-,residue} = \left[ B^{Srel} (4\pi\sigma^2)^{\frac{3}{2}} \sigma^3 \right] N_{ref}^2 \sigma^{-3} = B_{W-,residue}^{Srel} (4\pi)^{3/2} \sigma^3$ 

#### **Coarse-grain interactions**

$$U_{CG} = \sum_{bonds} U_{bond} + \sum_{i}^{N_T - 1} \sum_{j=i+1}^{N_T} U_{ev}(r_{ij}) + U_{el}(r_{ij})$$

$$\beta U_{bond}(r_{ij}) = \frac{3}{2b^2}(r_{ij} - r_0)^2$$
$$\beta U_{ev}(r_{ij}) = \frac{u_{ij}}{(2\pi(a_i^2 + a_j^2))^{3/2}}e^{-r_{ij}^2/2(a_i^2 + a_j^2)}$$
$$\beta U_{el}(r_{ij}) = \frac{l_B\sigma_i\sigma_j}{r_{ij}}erf\left(\frac{r_{ij}}{2\sqrt{a_i^2/2 + a_j^2/2}}\right)$$

 $a_i = 0.316 \text{ nm}$ : bead radius b: statistical segment length  $r_0 = 0$ : equilibrium bond distance  $u_{ij}$ : excluded volume  $\sigma_i$ : charge  $l_B = 561.6 \text{ nm}$ : Bjerrum length

## Sequence Dependent Water-Residue Effective Interaction



Excluded volume interaction with water

## **Gibbs Ensemble Simulations**

$$(n_{I}, V_{I}, T) \qquad (n_{II}, V_{II}, T)$$

$$(n_{I}, V_{I}, T)$$

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 $egin{aligned} V_T &= V_I + V_{II} & n_T &= n_I + n_{II} \ F(n,V_T,T) &= F_I(n_I,V_I,T) + F_{II}(n_{II},V_{II},T) \ &rac{\partial F}{\partial V_I} &= -(\Pi_I - \Pi_{II}) \ &rac{\partial F}{\partial n_I} &= (\mu_I - \mu_{II}) \end{aligned}$ 

 $\sum_{i=1}^{n} (n_{II}, V_{II}, T)$ 

$$\frac{\partial F}{\partial V_I} = -(\Pi_I - \Pi_{II}) = 0$$
$$\frac{\partial F}{\partial n_I} = (\mu_I - \mu_{II}) = 0$$

## Gibbs Ensemble Field Theory Simulation (FTS) convergence



# CG parametrization of peptide-water interaction using relative-entropy

Optimized parameters: Blurring sigma 0.35 E-W B=0. 182 R-W B=0.228



- The implicit solvent model cannot capture the heterogeneous dielectricity that may occur within the peptide-dense phase. In contrast, the explicit solvent model accounts for environment-dependent dielectricity, unlike the uniform dielectricity assumed in the implicit solvent model.
- This explicit solvent model can be parameterized to incorporate the effect of the peptide sequence on the effective interaction between residues and water into the coarse-graining (CG) process. Previous CG methods totally ignore this.
- As a result, the phase diagram derived from accurately transferring chemical details to the CG system is expected to capture any mesoscopic phase transitions and morphological complexities.

## All atom reference simulations for coarse graining



# Relative entropy parametrization of peptide and water interaction

RE1: Poly-Arg/Glu •••••••••••



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## Tau and Traumatic Brain Injury





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## Quantifying Water Structure: water triplet distribution



# Increased tetrahedral ordering of hydration waters near the L301 (mutant) compared to P301 (wild type)



## Dimer Simulations of jR2R3 and JR2R3-P301L









### Prof. Songi Han (Northwestern)



## Seeding





# Can jR2R3-P301L can seed the fibrillization of full length Tau?

## jR2R3-P301L can seed the fibrillization of full length Tau in Vitro



Fibril of Tau Fragment jR2R3-P301L

DNIKHVLGGS VQIVYK



## Full length Tau

<sup>272</sup> **GGK**<sup>274</sup> R1

С

- <sup>275</sup>vqiinkkldls-nvqskcgskdnikhvpgggs<sup>305</sup> R2
- <sup>306</sup>VQIVYKPVDLS-KVTSKCGSLGNIHHKPGGGQ<sup>336</sup> R3
- <sup>337</sup> vevksekldfkdrvqskigsldnithvpgggn<sup>368</sup> R4
- <sup>369</sup> KKIETHKLTFRENAKAKTD<sup>387</sup>

### Full Length Tau Fibrils

## jR2R3-P301L can seed the fibrillization of full length Tau in Vivo

## Before jR2R3 P301L



### After jR2R3 P301L



Cells expressing mclover3-Tau187-P301L seeded with jR2R3-P301L fibrils

# jR2R3-P301L acts as a prion: propagates the strain





Prof. Ken Kosik, UCSB

Cells seeded with jR2R3-P301L fibrils undergo division and propagate aggregates to daughter cells

Double Electron-Electron Resonance (DEER) Spectroscopy cannot distinguish between wild type and mutant





## Water Triplet Distribution

