

Integration of Experiments and Multiscale Simulations to Study

Intrinsically Disordered Proteins



A Prospectus Presented By Yumeng Zhang

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[Yumeng@Prospectus]\$ ls **Part1: Introduction&Significance** Part2: Specific Aims [Yumeng@Prospectus Part2: Specific Aims]\$ Is Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs [Yumeng@Prospectus Aim1*]\$ |s Subaim1a. IDP specific tight interactions: SPIN-NTD/MPO Subaim1b. IDP dynamic interactions: p53-NTD/CypD Subaim1c. IDP enzymatic interactions: Flaviviral proteases [Yumeng@Prospectus Aim2*]\$ Is Subaim2a. Advanced sampling method: REST3 Subaim2b. Optimized force field: HyRes*



[Part1]\$ Introduction

• Intrinsically disordered proteins (IDPs)

The protein disorder continuum



- Lack a fixed or ordered three-dimensional structures.
- Range from totally unstructured to partially structured.
- ✤ Rich in polar and charged residues.
- Large and functionally important class of proteins

- IDPs participates in diverse cellular processes
- Regulations
 - Specific tight bindings





(Complex: MPO/SPIN)







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[Part1]\$ Significance & Innovation



[Yumeng@Prospectus]\$ Part2: Specific Aims

Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs

[Yumeng@Prospectus Aim1]\$ Subaim1a. IDP specific tight interactions: SPIN-NTD/MPO Subaim1b. IDP dynamic interactions: p53-NTD/CypD Subaim1c. IDP enzymatic interactions: Flaviviral proteases

METHICILLIN-RESISTANT **STAPHYLOCOCCUS AUREUS**

THREAT LEVEL SERIOUS







\$1.7B Estimated attributable

- Although several treatments are still available, MRSA has become resistant to many first-line antibiotics.
- While MRSA infections overall are dropping, progress to prevent MRSA bloodstream infections in healthcare is slowing.

Staphylococcus aureus (S. aureus) are common bacteria that spread in healthcare facilities and the community. Methicillinresistant S. aureus (MRSA) can cause difficult-to-treat staph infections because of resistance to some antibiotics.

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U.S. Department of Health and Human Services Centers for Disease Control and Prevention

https://www.cdc.gov/drugresistance/pdf/threats-report/2019-ar-threats-report-508.pdf



[Subaim1a]\$ IDP Specific Tight Interactions: SPIN-NTD/MPO

- SPIN (Staphylococcal Peroxidase Inhibitor)
 - α-helical bundle
 - Intrinsic disordered N-terminal



Specific Binding (SPIN/MPO)



Disordered NTD in unbound state doi/10.1074/jbc.RA117.000134

β-hairpin structured NTD in SPIN/MPO co-crystal

[Subaim1a]\$ SPIN Functional Regions (EXPM)



Mystery:

Two SPIN have **identical structures** but **different inhibitory efficacies**.



S.delphini = **1588.49**

 We want to have crucial synergistic interaction insights...

MD Simulations Can offer!

Atomistic model: High resolution. CG model: Non-native and long-time scale details. K-State home » Biochemistry & Molecular Biophysics » E Geisbrecht Lab

Geisbrecht Lab



[Subaim1a]\$ Atomistic Simulations on SPIN/MPO



[Subaim1a]\$ "pseudo"-Free Energy Landscape for SPIN/MPO



[Subaim1a]\$ Atomistic Simulations on SPIN-NTD



[Subaim1a]\$ SPIN/MPO Tight Specific Binding Investigations

Hypothesis:

- SPIN-NTD structured β-hairpin stability influences inhibitory efficacy.
- More stable SPIN-NTD is, more preference to have the conformational selection mechanism.

MD Results:

- S.aureus NTD is more stable.
- Binding mechanism:
- a. S.delphini: cooperative binding.
- b. S.aureus: slightly conformationalselection.

Experimental Results:

- *S.aureus* shares high structural **identical** with *S.delphini*.
- **Binding affinity** has no influence on SPIN **inhibitory**.
- S.aureus shows
 highest inhibitory
 ability to MPO.

Validation:

- **Experiments:** Mutants with pre-folded NTD stabilized by disulfide bonds.
- MD simulations:

(Coupled binding and folding simulations under physiological conditions.)

- i. Atomistic models coupled with advanced sampling methods (i.e., REST, umbrella samplings...)
- ii. **CG models** for quick binding and folding process kinetics calculation.

Blueprint:

 Effective therapeutic strategies targeting SPIN-NTD.



[Yumeng@Prospectus]\$ Part2: Specific Aims

Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs

[Yumeng@Prospectus Aim1]\$

Subaim1a. IDP specific tight interactions: SPIN-NTD/MPO Subaim1b. IDP dynamic interactions: p53-NTD/CypD Subaim1c. IDP enzymatic interactions: Flaviviral proteases



Oxidative stress, mitochondrion and necrosis



[Subaim1b]\$ Regulative Interactions: p53/CypD

Cyclophilin D (CypD)



2. Refolding of p53 by Chaperones & CypD 1. Stress-induced translocation of p53 dissociation/ activation Trap1/HSP90 Trap1/HSP90 p53 ΓΙΜ/ΤΟΝ CypD p53 TIM/TOM? HSP60 CypD Matrix OMM mPTP Closed IMM mPTP Closed 3. CypD-mediated aggregation of p53 4. CypD opens mPTP p53 Trap1/HSP90 Trap1/HSP90 TIM/TOM? TIM/TOM? aggregated CvpD g p53 CypD mPTP Closed mPTP Open doi.org/10.1016/j.jmb.2016.08.001 doi/10.3389/fphys.2013.00076 p53/CypD triggering pore opening is Ca²⁺ independent. Interactions are dynamic without stable complex forming.

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[Subaim1b]\$ p53-NTD dominates p53/CypD interactions

- p53-NTD is the smallest binding region to CypD
- NTD-DBD has lower binding affinity



[Subaim1b]\$ HyRes Model Simulations on p53-NTD/CypD

CypD in HyRes model



• p53-NTD HyRes simulations (1 μs)

[Subaim1b]\$ CG MD Simulations on p53-NTD/CypD

Initial simulation setup



Simulation Trajectories



[Subaim1b]\$ Simulation & Experiment Preliminary Results



[Subaim1b]\$ p53-NTD/CypD Investigations



Potential Problem:

 HyRes protein model is a little overcompaction.



Fig. Radius of gyration results of NTD calculated in HyRes protein model in bound and unbound state.

Future plan:

- Optimize HyRes protein model (subaim2b)
- NTD-DBD studies.
- Therapeutic target: CypD, to protect in models of diseases.

MD Simulations:

- MD simulation results are highly consistent with experimental measurements.
- HyRes model is very powerful and can accurately describe IDP 2nd structural profiles and long-range intermolecular interactions.
- MD simulations can picture deeper insights and capture more comprehensive interaction dynamics.

[Yumeng@Prospectus]\$ Part2: Specific Aims

Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs

[Yumeng@Prospectus Aim1]\$

Subaim1a. IDP specific tight interactions: SPIN-NTD/MPO Subaim1b. IDP dynamic interactions: p53-NTD/CypD

Subaim1c. IDP enzymatic interactions: Flaviviral proteases



Figure 1. Distribution of major flaviviruses discussed in this article. Information was adapted from data and figures provided on Centers for Disease Control and Prevention (CDC) and World Health Organization (WHO) websites.

[Subaim1c]\$ Flavivirus NS2B/NS3 proteases



[Subaim1c]\$ Flavivirus NS2B/NS3 Proposed Research Plan

Chen Research Group

University of Massachusetts Amherst

 ClyA nanopore tweezers tool for probing NS2B/NS3 proteases

Jianhan Chen Research Group

Computational Biophysics and Biomaterials

 Advanced multi-scale samplings to investigate NS2B/NS3 proteases



[Yumeng@Prospectus]\$ Part2: Specific Aims

Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs

[Yumeng@Prospectus Aim2]\$ Subaim2a. Enhanced sampling method: REST3 Subaim2b. Optimized force field: HyRes*





doi: 10.3389/fphar.2018.00923 doi: 10.1021/acs.accounts.5b00536

[Subaim2a]\$ Enhanced Sampling Methods for Atomistic Models

i.e., Temp Low ->High

Atomistic Simulations limitation:

Complex system is frequently **trapped** in local minima.



1 μ s simulation: only 10 ps may come to transition state.

We can merely capture it!

doi.org/10.1016/S0009-2614(00)00999-4

• Approaches:

Realize random walking on energy surface.

Replica Exchange method (REM)



Time (Exchange neighbor replicas from condition m to n)

• Transition probability: $w(X \to X') \equiv w(x_m^{[i]} | x_n^{[j]}) = \begin{cases} 1, & \text{for } \Delta \leq 0, \\ \exp(-\Delta), & \text{for } \Delta > 0, \end{cases}$

 $\Delta \equiv \left[\beta_n - \beta_m\right] \left(E(q^{[i]}) - E(q^{[j]})\right) \text{ (Acceptance rate)}$

• Cons: $N_{rep} \propto O(f^{1/2})$

 $A = min \{1, exp(-\Delta \beta \Delta E)\}$

e.g., One hairpin protein system: molecule + water 4342 atoms -> 64 Reps

N_{rep}↑

 $\Delta E \uparrow, A_{min} \downarrow$

[Subaim2a]\$ Enhanced Sampling Method: REST1

- REST (Replica Exchange Solute Tempering)
 a. REST 1:
- i.e., System: Alanine Dipeptide + 512 water $\Delta_{nm} = -\beta_m [E_m(X_n) - E_m(X_m)] - \beta_n [E_n(X_m) - E_n(X_n)].$ Conditions: 300 K - 600 K REM: ΛE $E_0(X) = E_p(X) + E_{pw}(X) + E_{ww}(X)$ P(E) P(E) 0.005 0.05 (*E*_{ww} Kept) -4500 -400 Potential energy (kcal/mol) -4000 -60 $E_{n} + 0.5 E_{nw}$ (kcal/mol) **REM: N=22** REST1: N=3 $E_m(X) = E_p(X) + \left[\frac{\beta_0}{\beta_m}\right] E_{ww}(X) + \left[\frac{\beta_0 + \beta_m}{2\beta_m}\right] E_{pw}(X)$ Cons: Low exchange rate for complex system with big conformational changes. i.e., β-hairpin system $\Delta_{nm} = (\beta_n - \beta_m) [(E_p(X_m) + \frac{1}{2}E_{pw}(X_m)) - (E_p(X_n) + \frac{1}{2}E_{pw}(X_n))]$ 300 K 322 K 345 K REST1: N=18 $\Delta \boldsymbol{\beta}$ REST1: ∆E a 0.02 $|E_{\rm p} + (1/2)E_{\rm pw}| \ll |E_{\rm p} + E_{\rm pw} + E_{\rm ww}|$ Why efficient? P(E 0.01 doi.org/10.1021/jp068826w -700 -600 E_{pp} + (1/2) E_{pw} (Kcal/mol) doi 10.1073 pnas.0506346102
- REST1: Pros & Cons
- Pros: high efficiency, accuracy.

[Subaim2a]\$ Enhanced Sampling Method: REST2

• REST (Replica Exchange Solute Tempering)

b. REST 2:

$$\begin{aligned} \text{REST1:} \quad E_m(X) &= E_p(X) + \left[\frac{\beta_0}{\beta_m}\right] E_{ww}(X) + \left[\frac{\beta_0 + \beta_m}{2\beta_m}\right] E_{pw}(X) \\ \text{REST2:} \quad E_m^{\text{REST2}}(X) &= \frac{\beta_m}{\beta_0} E_{pp}(X) + \sqrt{\frac{\beta_m}{\beta_0}} E_{pw}(X) + E_{ww}(X) \\ \Delta_{nm}(\text{REST1}) &= (\beta_n - \beta_m) [(E_p(X_m) + \frac{1}{2}E_{pw}(X_m)) - (E_p(X_n) + \frac{1}{2}E_{pw}(X_n))] \\ \Delta_{mn}(\text{REST2}) &= (\beta_m - \beta_n) \left[(E_{pp}(X_n) - E_{pp}(X_m)) + \frac{\sqrt{\beta_0}}{\sqrt{\beta_m} + \sqrt{\beta_n}} (E_{pw}(X_n) - E_{pw}(X_m)) \right] \\ \end{aligned}$$

$$\begin{aligned} \text{Why efficient?} \qquad \Delta_{mn} E_{REST2} &\leq \Delta_{mn} E_{REST1} \\ &= \left| \sqrt{\beta_0 * \beta_m} E_{pw} \right| &\leq \left| \frac{\beta_0 + \beta_m}{2} E_{pw} \right| (\beta_m < \beta_0) \end{aligned}$$

<u>doi.org/10.1021/jp204407d</u>

Initial (Folding): **i.** $\beta_f E_{pp} + \beta_f E_{pw} + \beta_f E_{ww}$ Final (Unfolding): • REX: **ii.** $\beta_u E_{pp} + \beta_u E_{pw} + \beta_u E_{ww}$ ***** E_{ww} is excluded from exchange. **REST1:** • iii. $\beta_u E_{pp} + \frac{(\beta_u + \beta_f)}{2} E_{pw} + \beta_f E_{ww}$ *E_{pw}* is scaled down for higher acceptance rate. **REST2:** ٠

 $\beta_u E_{pp} + \sqrt{\beta_f \beta_u E_{pw}} + \beta_f E_{ww}$

[Subaim2a]\$ REST2 Simulations on Bcl-xL



[Subaim2a]\$ REST2 Incorrect IDP Ensembles Under High Temp

p53-NTD in multiple atomistic models coupled with REST2 protocol



- Severe Compact under high T:
- Over down-scaled Protein-Water interactions.



 Unbalanced intra-/intermolecular interactions.

[Subaim2a]\$ REST2 Unbalanced Intra/Inter molecular interactions

Multiple IDPs tested with REST2 protocol in a99sb-disp force field

• Templates:

KIX (28 residues)



- REST2 limitations:
- Insufficient conformational sampling between middle replicas.
- 2. Incorrect IDP overcompact ensembles under high temperature.





Radius of gyration of AAQAA under different conditions



[Subaim2a]\$ Enhanced Sampling Method: REST3

Strategy

Folding: $\beta_f E_{pp} + \beta'_f E_{pw} + \beta_f E_{ww}$ Unfolding: $\beta_u E_{pp} + \beta_f' E_{pw} + \beta_f E_{ww}$

• Step 1: Standard High Temperature MD simulations as guidance



Step 2: Rescale P-W interactions to find the balance via vdW term



• Step 3: Set up replica exchange simulations with optimized REST3 p-p/p-w values.

[Subaim2a]\$ Potential Problems

Sufficient conformational sampling?



Sector Sector

✤ Appropriate for smaller and larger IDPs as well?

[Yumeng@Prospectus]\$ Part2: Specific Aims

Aim1. Integration of MD simulations and experiments for IDP studies Aim2. Advanced methods for multi-scale simulations on IDPs

[Yumeng@Prospectus Aim2]\$

Subaim2a. Advanced sampling method: REST3

Subaim2b. Optimized force field: HyRes*



Neglect Non-native potentials



Reduced representation of interaction sites per residue.

To **Coarse Grain** a system:

- Energy based
- Force matching
- Structure based

Most computational efficiency while maintaining adequate degree of details.

<u>doi: 10.1063/1.4818908</u> doi: <u>10.1021/acs.chemrev.6b00163</u>

[Subaim2b]\$ HyRes Protein Model

Foundations

 $U = U_{\text{bond}} + U_{\text{angle}} + U_{\text{dihedral}} + U_{\text{improper}} + U_{\text{CMAP}} + U_{\text{Hbond}} + U_{\text{LJ}} + U_{\text{elec}}$



Non-bonded term





 $\varepsilon_i = 70 \% \varepsilon_{i, \text{CHARMM19}}$



Over-compaction
 Lack solvation term.

$$W(\mathbf{r}) = V_{\mathrm{solute}}(\mathbf{r}) + V_{\mathrm{solvation}}(\mathbf{r})$$

DOI: 10.1039/c7cp06736d



[Subaim2b]\$ 1st Adjustment: Weaken Intramolecular Interactions

Lennard-Jones parameters for all side chain beads Table 3 $r_i^{\rm min}/2$ (Å) $r_i^{\min}/2(1-4)$ (Å) CG bead ε_i (kcal mol⁻¹) Residue CB -0.3082.12 2.12 Ala Val CB -0.622.752.75CB -0.92.96 2.96 Leu Ile CB -0.7722.97 2.97 CB -0.6362.98 3.68 Met CB -0.182.65 3.25 Asn CB -0.1483.11 Asp 2.61Gln CB -0.2042.89 3.89 CB -0.142.85 Glu 3.95 Cys CB -0.5322.47 2.77CB -0.1882.322.72 Ser Thr CB -0.2282.62 2.62CB 2.77-0.2122.77Pro CB -0.05Lys 2.783.48 CC -0.052.36 Lys 3.06 Arg CB -0.1352.78 3.18 CC -0.1352.542.94 Arg His CB 2.34 -0.1082.64CC His -0.0812.18 2.48 CD -0.081His 2.11 2.41Phe CB -0.222.64 2.94 Phe CC -0.222.33 2.63 CD Phe -0.222.33 2.63 CB -0.1972.64 2.94 Tvr CC -0.197Tyr 2.33 2.63 CD -0.09842.45 2.75 Tyr Trp CB -0.1682.42 2.72CC -0.0842.24 2.54Trp CD -0.1682.39 Trp 2.09 CE -0.1682.33 2.63 Trp CF 2.33 2.63 Trp -0.168



Distance (Angstrom)

Residue Number

[Subaim2b]\$ 2nd Adjustment: Introduce Solvation Term

DOI: 10.1002/prot.10001

Solvent-accessible surface area (SASA) : •

$$W(\mathbf{r}) = V_{\text{solute}}(\mathbf{r}) + V_{\text{solvation}}(\mathbf{r})$$

$$V_{\text{solvation}}(\mathbf{r}) = \sum \sigma_i A_i(\mathbf{r})$$
$$A_i(\mathbf{r}) = S_i \prod_{i=1}^{M} [1 - p_i p_{ij} b_{ij}(r_{ij}) / S_i]$$

$$S_i = 4\pi (R_i + R_{\mathrm{probe}})^2$$



Three templates for testing

- 2EVQ (beta sheet) •
- (AAQAA)₃ (helix) •
- KIX (helix) •

Simulations: under 450 K, from folded to extended conformations.



[Subaim2b]\$ Implicit Solvent Model Help to Decrease Compaction

• SASA correlates well with ture surface calculated value



Testing template: poly-Glycine
Ramachandran Plot



[Subaim2b]\$ Potential Problems

 Poly-Alanine for secondary structures tuning.



(5)

$$U_{\text{dihedral}} = \sum_{\text{dihedrals}} k_{\chi} [1 + \cos(n\chi - \delta)]$$

$$U_{\rm improper} = \sum_{\rm impropers} k_{\psi} (\psi - \psi_0)^2 \tag{6}$$

$$U_{\rm Hbond} = \sum_{\rm Hbonds} \varepsilon_{\rm HB} \left[5 \left(\frac{\sigma}{r}\right)^{12} - 6 \left(\frac{\sigma}{r}\right)^{10} \right] \cos^4 \theta_{\rm AHD}$$
(7)

$$U_{\text{CMAP}} = \sum_{\text{non-Gly,non-Pro residues}} U_{\text{CMAP}}(\phi, \psi)$$
 (8)

Implicit solvent model

• • •	DydW a ()	p h(i)	h	c a 1 1-1 \$-2	
Atom type	$R_{\min}^{\text{value} a}(A)$	$R_i^{o}(\mathbf{A})$	p_i^{b}	$\sigma_i^{\rm c}$ (kcal mol ⁻¹ A ⁻²)	Description
С	2.1	1.72	1.554	0.012	Carbonyl carbon
CH1E	2.365	1.80	1.276	0.012	Extended aliphatic carbon with 1 hydrogen
CH2E	2.235	1.90	1.045	0.012	Extended aliphatic carbon with 2 hydrogens
CH3E	2.165	2.00	0.880	0.012	Extended aliphatic carbon with 3 hydrogens
CR1E	2.1	1.80	1.073	0.012	Extended aromatic carbon with 1 hydrogen
NH1	1.6	1.55	1.028	-0.060	Amide nitrogen
NR	1.6	1.55	1.028	-0.060	Aromatic nitrogen with no hydrogens
NH2	1.6	1.60	1.215	-0.060	Not to two hydrogens
NH3	1.6	1.60	1.215	-0.060	MASSitrogen Hound to t008e hydamidesH in backbone
NC2	1.6	1.55	1.028	-0.060	MA\$\$uani31nNum ni14.007 ! backbone N (Pro)
Ν	1.6	1.55	1.028	-0.060	MASS roline 11 14.007 ! backbone N (non-Pro)
OH1	1.6	1.52	1.080	-0.060	MASS ydros
0	1.6	1.50	0.926	-0.060	MASSarboil2 CHErger13.019 ! CA in backbone (non-Glv)
OC	1.6	1.70	0.922	-0.060	MASSarbol13 62Egen14.027 ! CA in backbone (Gly)
S	1.89	1.80	1.121	0.012	MA\$\$ _{ulph} 14 C3E 15.035 ! CH3 in Ala, and capping group
SH1E	1.89	1.80	1.121	0.012	MASS xtended Sulph 12,01100 hydliphatic carbon
Η	0.8	1.10	1.128	0.000	Polar hydrogen
HC	0.6	1.10	1.128	0.000	Polar hydrogen (in Arg, Lys and N-term)

Solvent accessible surface

Shielded_SASA

Shielded_SASA

^aThe CHARMM PARAM19 van der Waals radii are given as a basis of comparison but are not used in the solvation term.

- Sidechain shielding
 Smaller calculated surface value
- ***** ...

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