



Research | Education | Responsibility

Inhibiting Protein Amyloid Aggregation with Nanoparticles

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Protein misfolding diseases

- An increasing list of protein misfolding diseases
 - Alzheimer's disease $-A\beta$
 - Parkinson's disease α-synuclein
 - Huntington's disease huntingtin
 - Type-2 Diabetes Islet Amyloid Polypeptide
 - Amyotrophic Lateral Sclerosis SOD1

Common hallmarks

- Fibrillar aggregates regular structures from different precursors
- Long process; rare nucleating events
- Symptoms typically appear in mid to later life (50-70 years)



Amyloid fibril - the common cross-beta structure



Ding F., Dokholyan N.V., Buldyrev S.V., Stanley H.E. and Shakhnovich E.I., J Mol Biol, 324, 851-857 2002

Nucleation Process – Sigmoidal Kinetics



Inhibitor design – targeting each of the step

Nanoparticles as catalysts for protein fibrillation



Linse S. et al, PNAS 104:8691-6, 2007 Colvin VL and Kulinowski KM, PNAS 104:8679-8, 2007

Aggregation promoting or inhibiting – the contrasting effects of NPs?

| Nanoparticles | Proteins | Effects on Amyloid Aggregation |
|------------------------------|-------------------|--------------------------------|
| Multi-walled CNT, | 0.2 | |
| QDs, Copolymer NP, | p-2 microglobulin | |
| $CeO_2 NP^{23}$ | | Promotion |
| $TiO_2 NP^{43}$ | Αβ | |
| AuNP ⁷⁵ | lysozyme | |
| Graphene oxide ⁶⁷ | Αβ | |
| AuNP ⁴⁵ | Αβ | |
| CNT^{42} | $A\beta_{16-22}$ | Inhibition |
| Carbon Dots ⁷⁶ | Insulin | |
| Polymeric NP ⁶⁸ | Αβ | |
| Polystyrene NP ³⁷ | Αβ | Either promotion or inhibition |

Q: What are the <u>determinants</u> of NPs and/or proteins for the complex and seemingly contrasting behaviors?

Objective – Amyloid-inhibiting nanomedicine

Outline

Multiscale modeling approach

- DMD simulations
- Multiscale models
- Uncovering the effects of NPs on protein aggregation
 - Varying NP-Protein attractions
 - Competing aggregation in solution and on NP surface
 - A complete picture of protein aggregation influenced by NPs
- Applications of anti-amyloid Nanomedicine
 - Graphene oxide
 - Dendrimer

Challenges in computational modeling: multiscale modeling

10-6

Length scale, m 10⁻¹¹ 10⁻¹⁰ 10⁻⁹ 10⁻⁸ 10⁻⁷ Chemical bonds Small molecules Protein cor and aggregates



Large **gaps** of time and length scales between experimental observation and the underlying molecule system

Approaches: Enhanced sampling methods Simplified protein models

Ding F. and Dokholyan N.V., Trends in Biotechnology, (2005)

Enhanced MD method: DMD





- **Dynamics become event-driven:**
 - collision prediction,
 - sorting for next collisions,
 - updating the colliding atoms

Alder and Wainwright, J. Chem. Phys. 27:1208 (1957); Zhou Y and Karplus M, PNAS, 94, 14429 (1997); McCammon, J.A., Gelin, B.R. & Karplus, M. Nature 267, 585–590 (1977); Dokholyan NV et al., *Folding & Design*, (1998)

Multi-scale protein models F. Ding et al, *Biophys. J.*, Four-Bead, $c_{\beta i}$ F. Ding et al, Proteins, Two-Bead i-1 i+1 83:3525 (2002) 53:220 (2003) $N_{i+1} \Phi$ C_{i+1} Ψ $C_{\beta i+1}$ Time scale: ~seconds-hours Time scale: ~seconds Applications: 2nd structure transition, Protein Applications: Protein folding/misfolding, folding/misfolding, Protein aggregation Protein aggregation, Pseudo all-atom All-atom F. Ding, et al., Structure, F. Ding et al., Biophy. J., (2008)88:147 (2005) Residue i+1 Residue i+1 **Residue** i Resdiue i SER MET Cy2 Time scale: ~µs-ms Time scale: ~µs Applications: Protein folding/misfolding, Applications: Folding of small proteins; near-native dynamics; and protein unfolding aggregation of short peptides

Multiscale DMD simulations

Ab initio protein folding



Coarse-grained simulation of protein aggregation



F. Ding, D. Tsao, H. Nie and N.V. Dokholyan, *Structure* (2008) F. Ding, Y. Furukawa, N. Nukina, and N.V. Dokholyan, *JMB*(2012)

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- Multiscale modeling approach
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Coarse-grained modeling of NPs



Effects: NP-protein attractions (affinities), relative concentrations, competition between bulk and surface, etc.

Complex effects of NP-Protein attractions on protein aggregation



The dependence of protein surface concentration on NP-Protein attractions



Increasing NP-protein attractions leads to more proteins on NP surface

The dependence of diffusion on NP-protein attractions



Increasing NP-protein attractions leads to **decreased protein diffusion** on NP surface.

Dependence of protein concentrations (fixed attraction)



Aggregation on NP surface is concentration dependent

Effect of relative protein/NP concentration



A multi-factorial effects of NPs on aggregation



Radic, S., Ke PC, Davis, TP, Ding F., RSC Adv., 2016 Galvagnion, Nat Chem Biol. 2015 Mar;11(3):229-34.

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Graphene oxide inhibits IAPP aggregation and cytotoxicity

Graphene oxide sequesters IAPP



Nedumpully-Govindan et al, PCCP, 18:94-100 (2016)

Biophysical characterization of GO-IAPP interaction



GO reduces cytotoxicity of IAPP



PAMAM dendrimer inhibits IAPP aggregation and cytotoxicity

PAMAM dendrimer binds the amyloidogenic region of Amyin monomer



PAMAM dendrimer inhibits dimerization



Biophysical characterization of the antiaggregation effects – DLS, ThT, TEM



Inhibition of IAPP cytotoxicity in vitro and ex vivo



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Summary

- A multiscale approach for modeling protein aggregation at the Nano-Bio interface with long time scales and large system sizes
- A mechanistic insight about the complex and seemingly contrasting effects of NPs on amyloid aggregation
- Utilizing the anti-aggregation effects of NPs for antiamyloid nanomedicine design.

Acknowledgement

Bo Wang Xinwei Ge Praveen Nedumpully-Govindan, PhD Slaven Radic, PhD

Thomas P. Davis, PhD Pu-Chun Ke, PhD Esteban Gurzov, PhD Emily Pilkington Aleksandr Kakinen, PhD

Funding:

NSF NIH EPA CU

