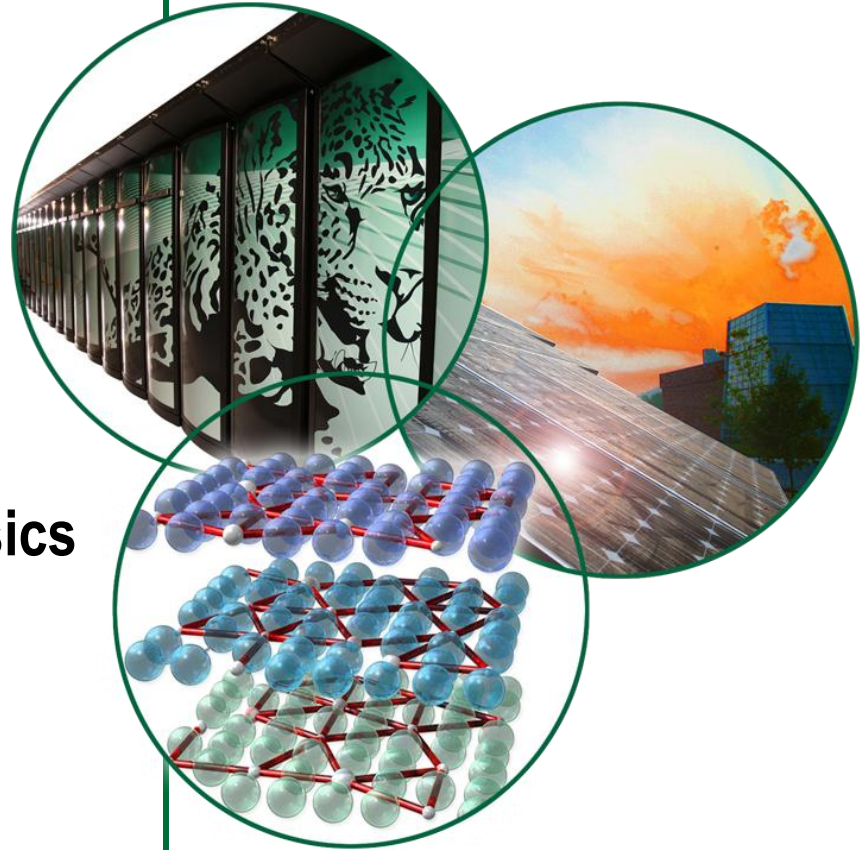


# Computer Simulation of Lignocellulosic Biomass

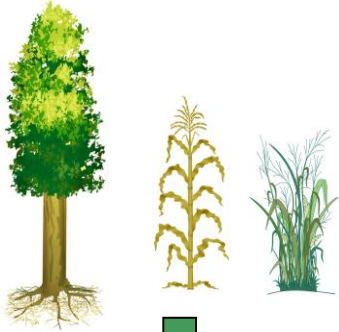
Loukas Petridis

UT/ORNL Center for Molecular Biophysics  
Oak Ridge National Laboratory

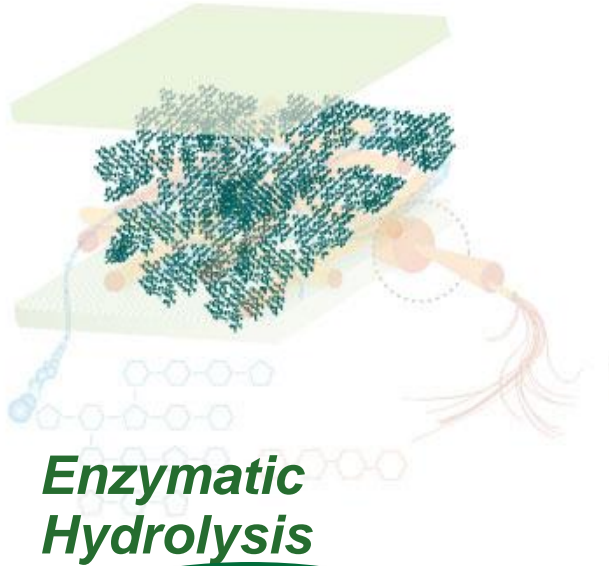
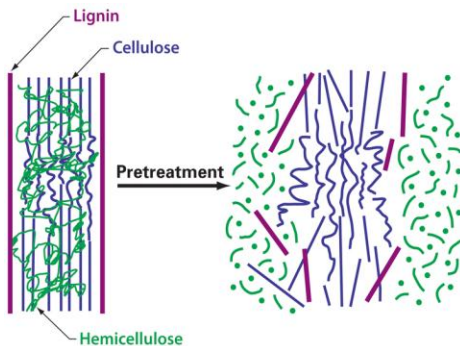


# Cellulosic Ethanol Production

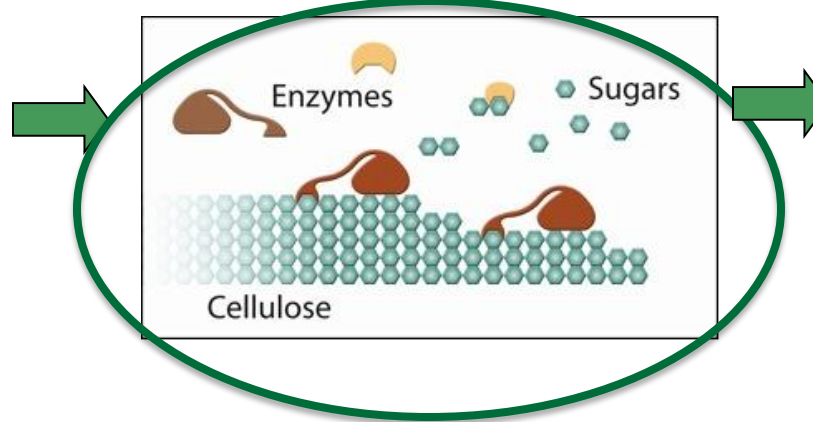
*Ligocellulosic Biomass*



*Pre-treatment*



*Enzymatic Hydrolysis*

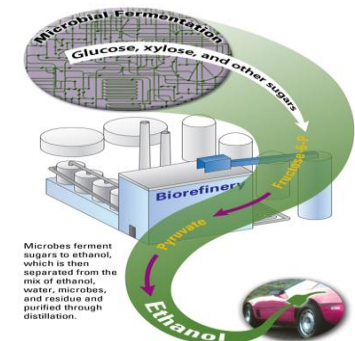


Cellulose

Hemicellulose

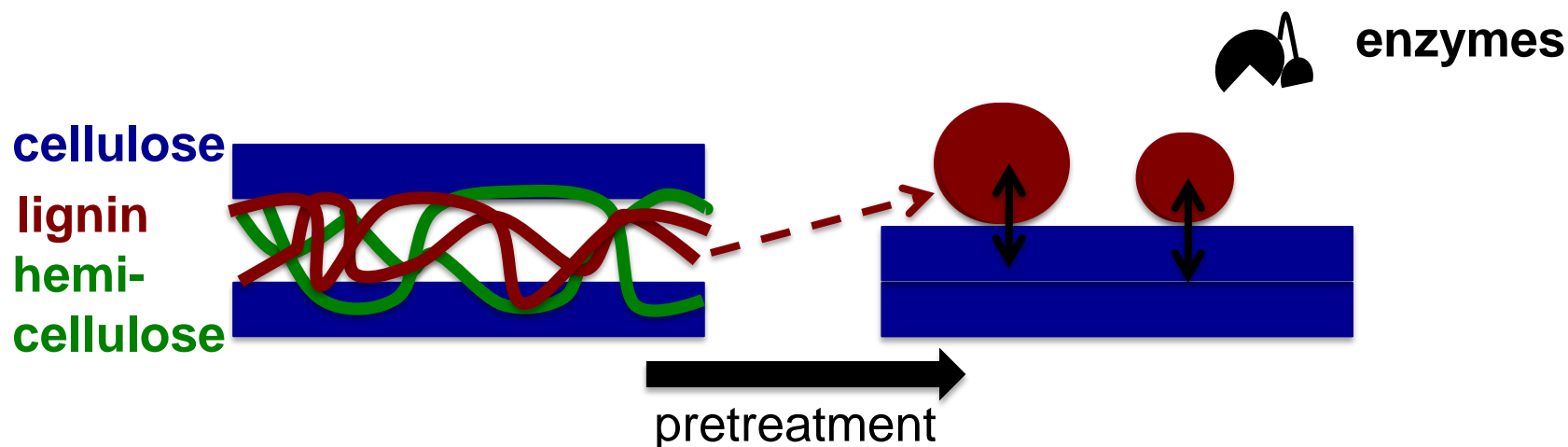
Lignin

*Fermentation*



**bottleneck: biomass recalcitrance**

# Physical Origins of Recalcitrance

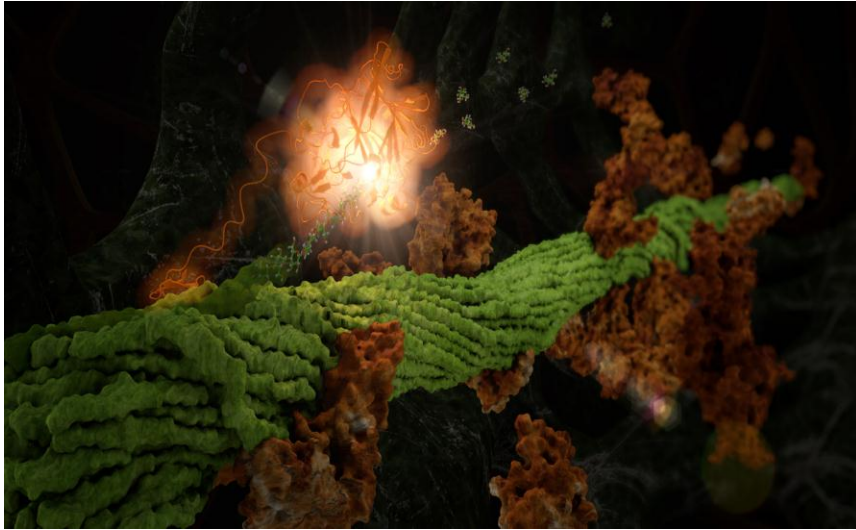


Collapse of lignin

Enzyme:lignin interaction (Structure of lignin aggregates)

Lignin:cellulose association

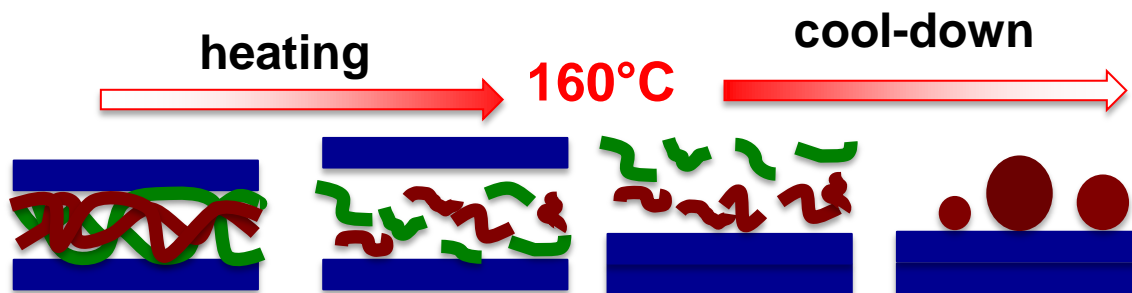
# Petascale Molecular Dynamics Simulation



**Comparison to Experiments**

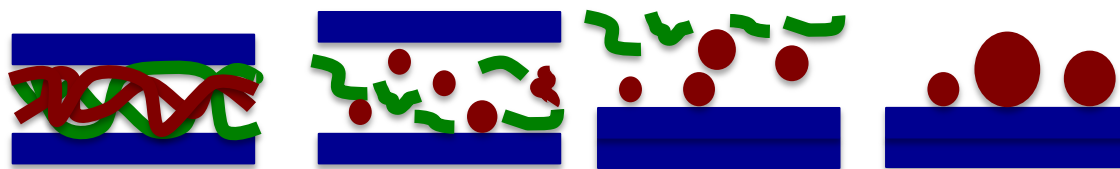
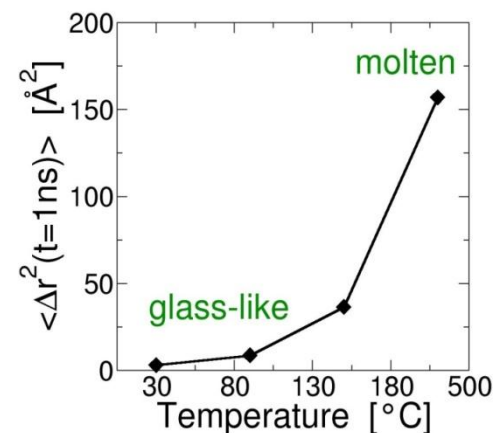
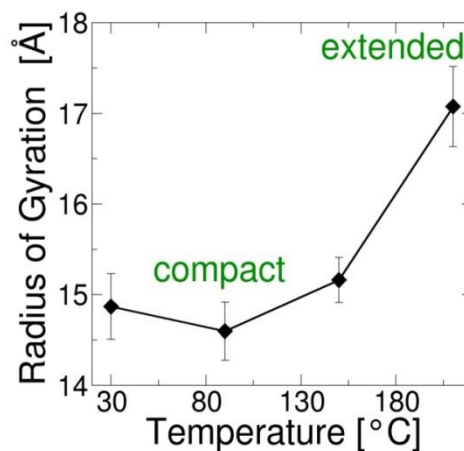
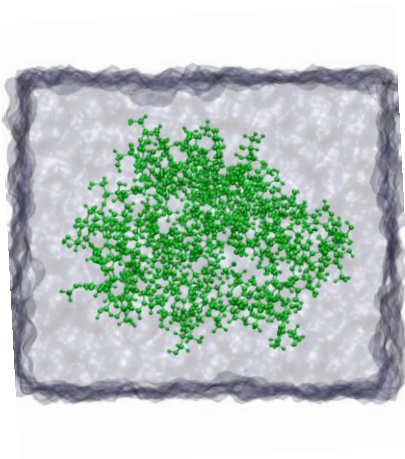
**Physical Insights**

# Temperature Dependence of Lignin



Old: lignin aggregation during cool-down

DOE  
INCITE

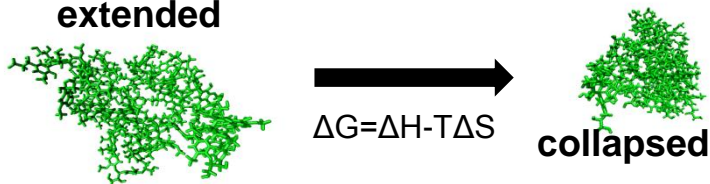


New: lignin aggregation during heating

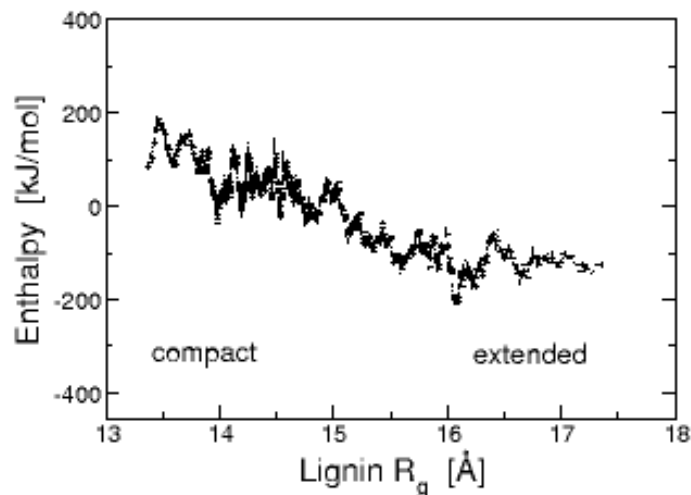


# Why Does Lignin Collapse at Room Temp?

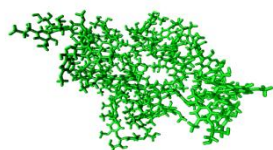
extended



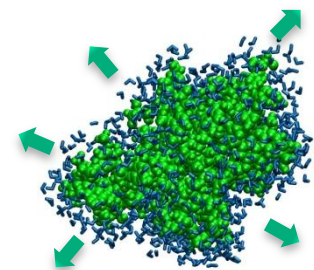
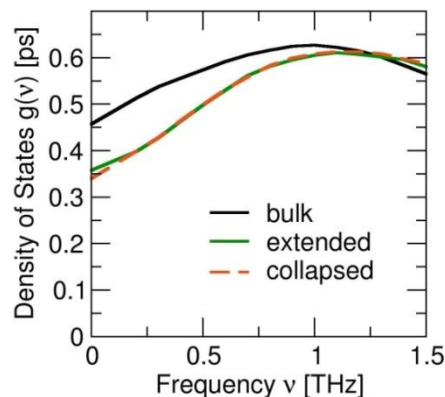
- **Enthalpy**
- $\Delta H \approx +200$  kJ/mol **Unfavorable**



- **Lignin configurational entropy**
- $-T\Delta S_{\text{conf}} \approx +10$  kJ/mol **Unfavorable**



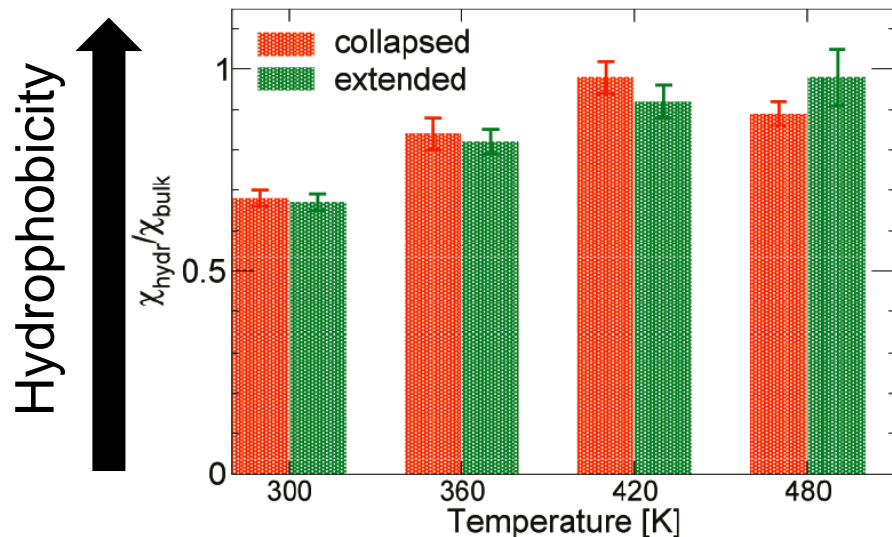
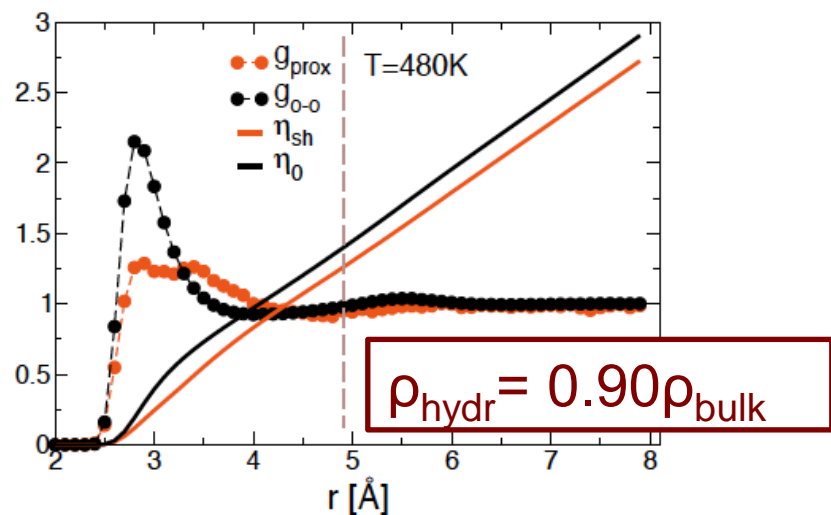
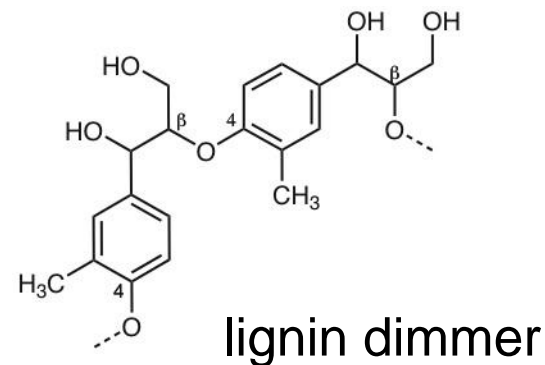
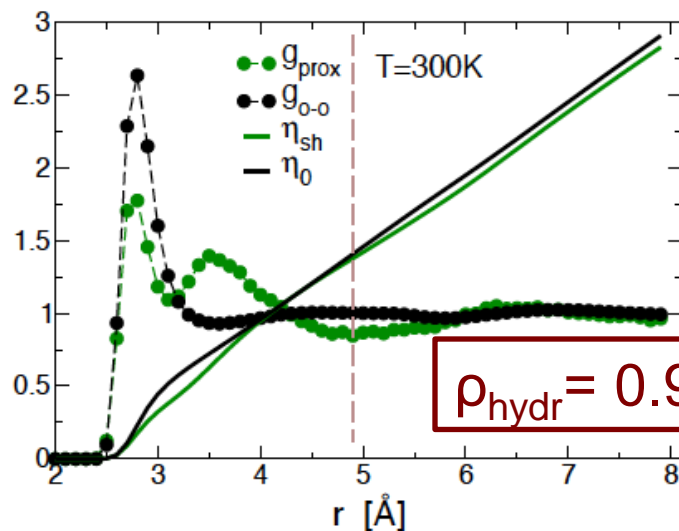
- Hydration **water translational & rotational entropy**
- $-T\Delta S_{\text{t+r}} \approx -100$  kJ/mol **Favorable**



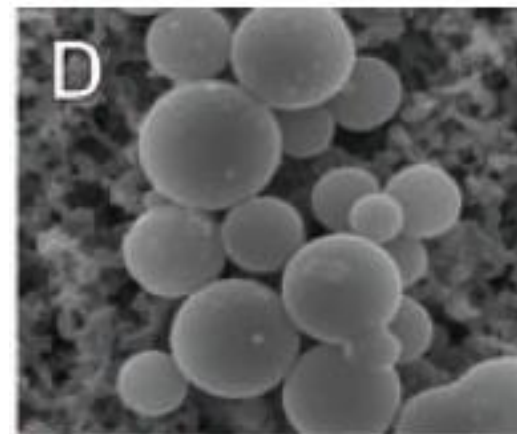
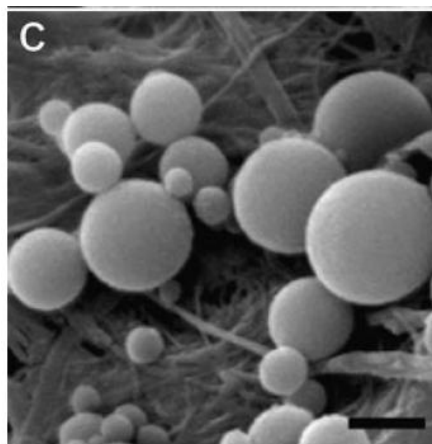
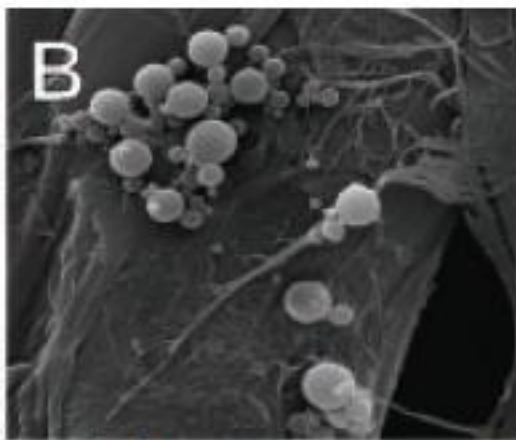
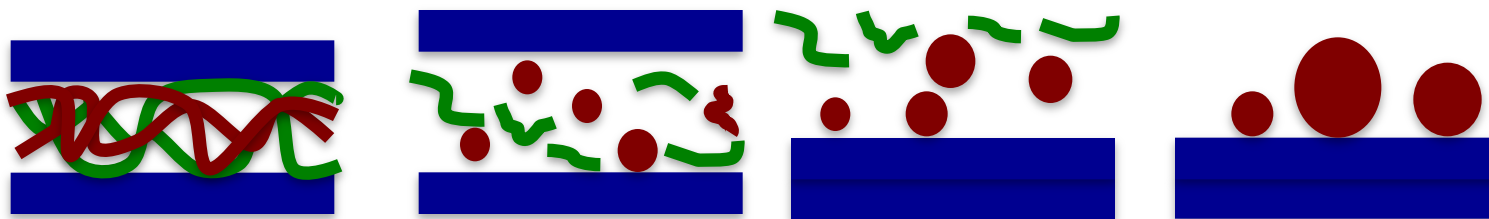
- Hydration **water compressibility**
- $-T\Delta S_{\text{fluc}} \approx -300$  kJ/mol **Favorable**

**Collapse Driven by Removal of Entropically Unfavorable Water Molecules from Lignin Surface to Bulk**

# Lignin surface is “wet” at room T, more hydrophobic at high T



# Biomass Pretreatment

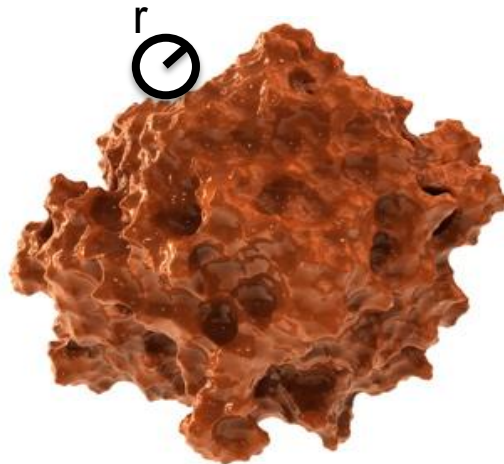


## Are Lignin Aggregates Spheres?



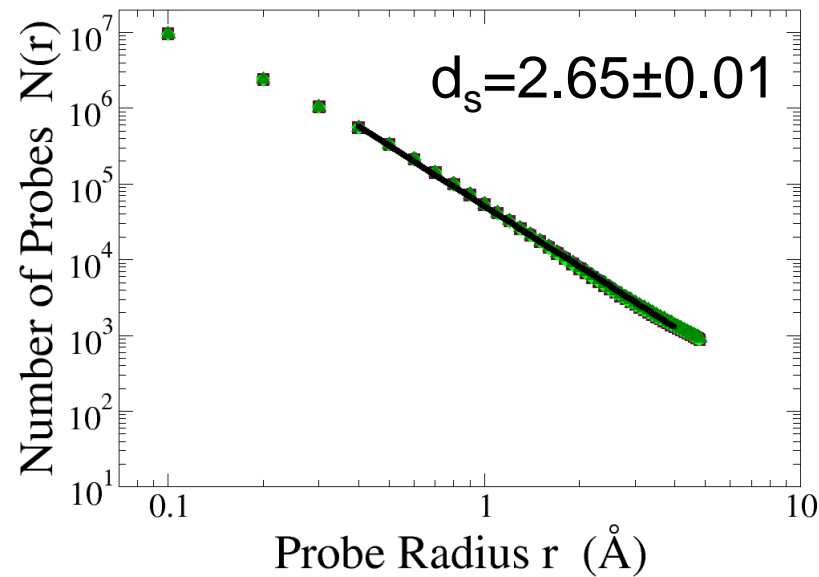
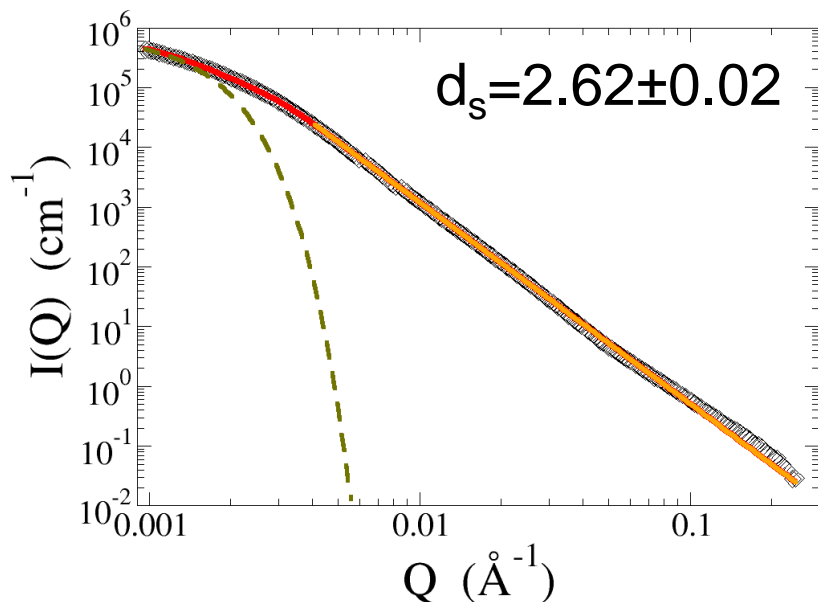
## Small-Angle Neutron Scattering

$$I(Q) \propto Q^{d_s-6}$$

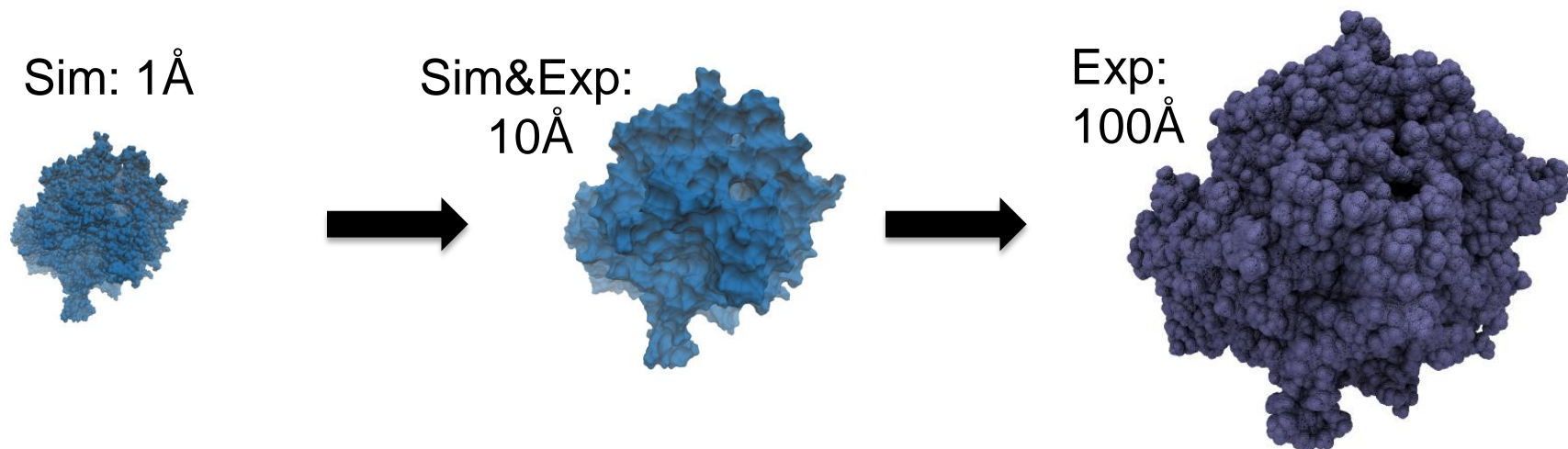


## Molecular Dynamics Simulation

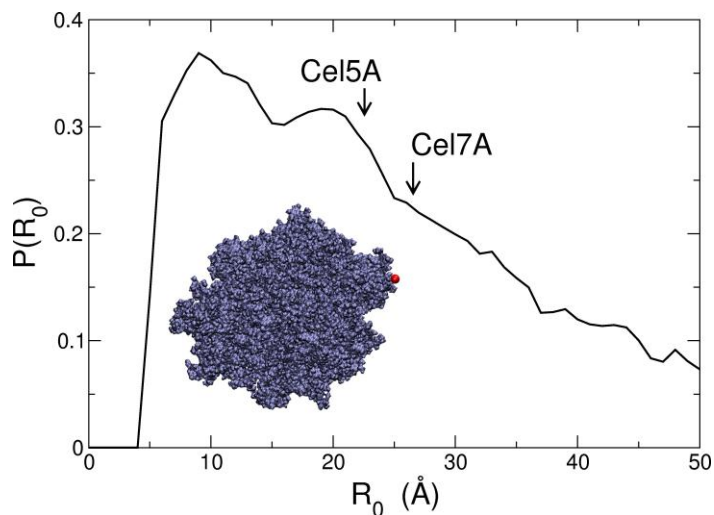
$$N(r) = r^{-d_s}$$



# Shape of Surface Invariant Under Change of Scale



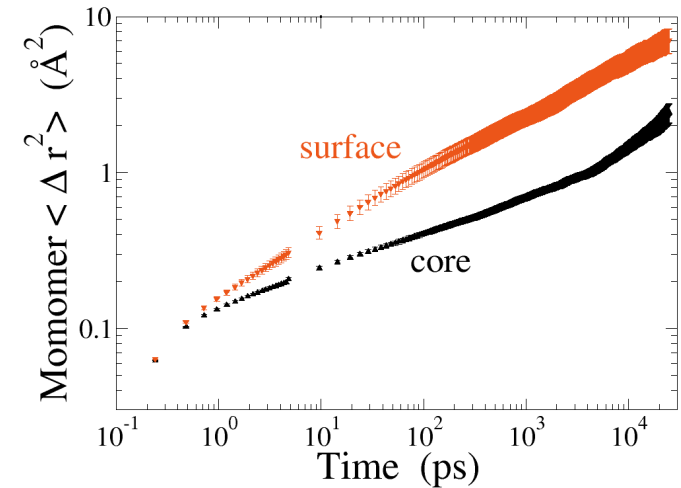
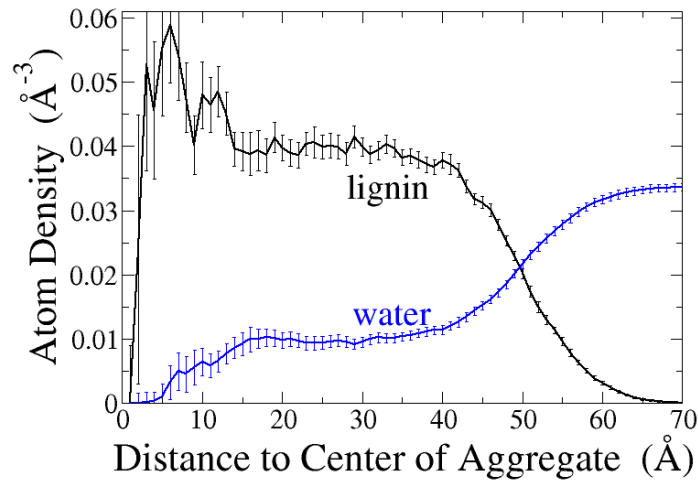
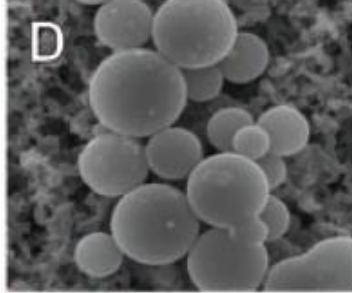
## Surface Morphology Impacts Enzyme Inhibition



Enzyme:lignin  
interaction  
distribution



# Are Lignin Aggregates Solid Spheres?

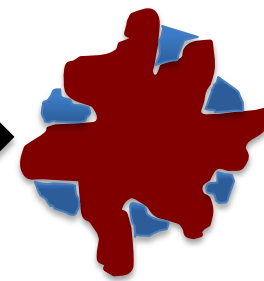


rigid sphere

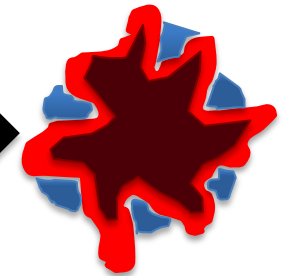
SANS  
MD



Highly folded  
surface



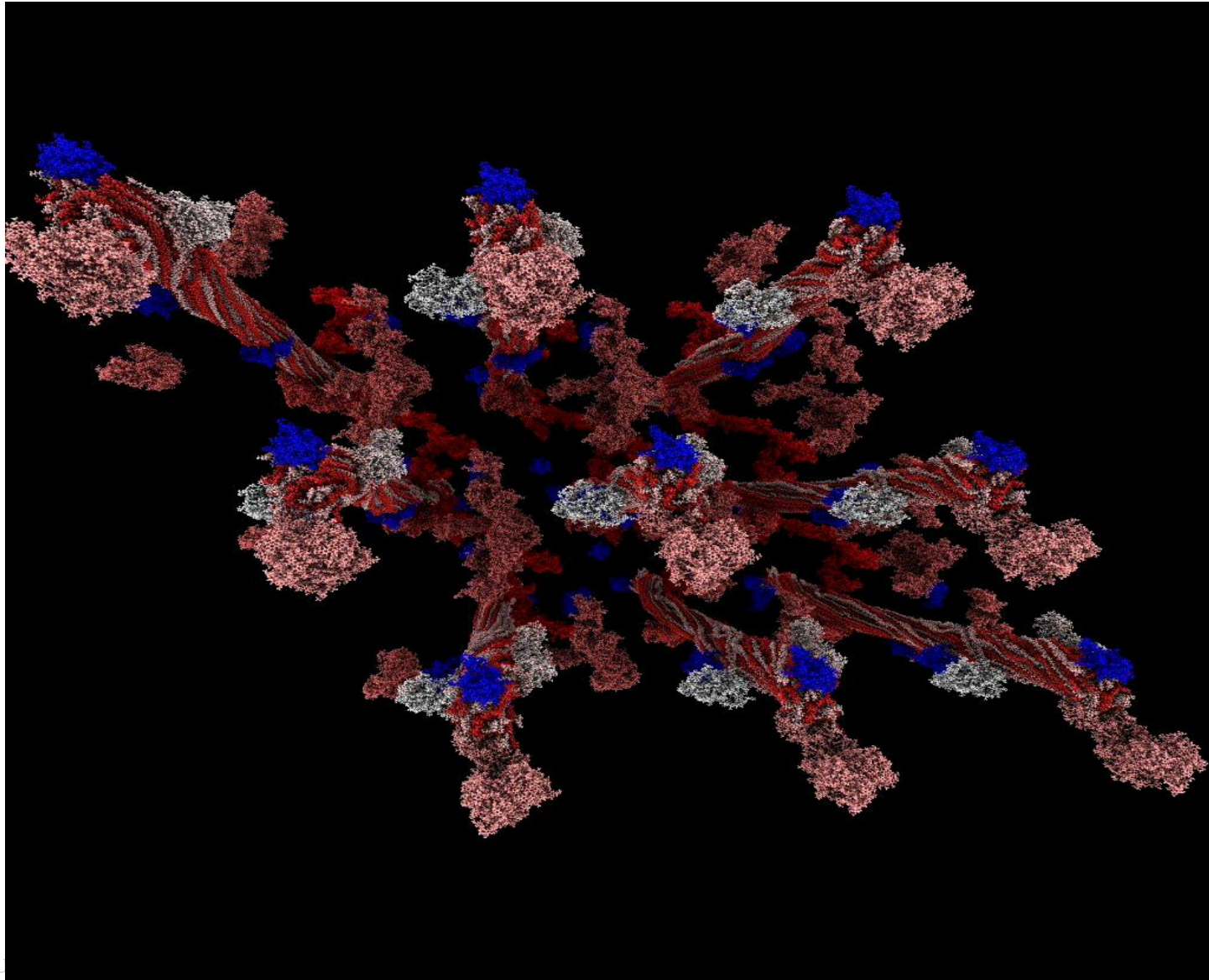
Water  
penetration



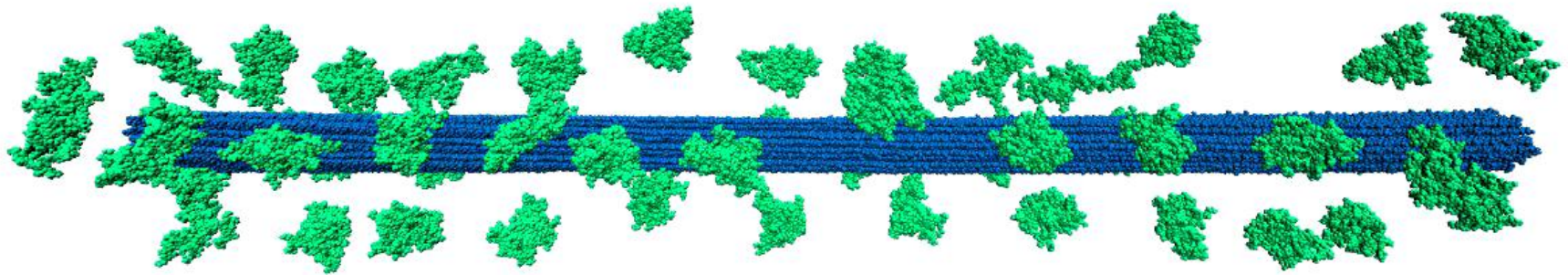
Rigid core  
Fluid surface

Petridis et al., Phys. Rev. E 83 061911 (2011)

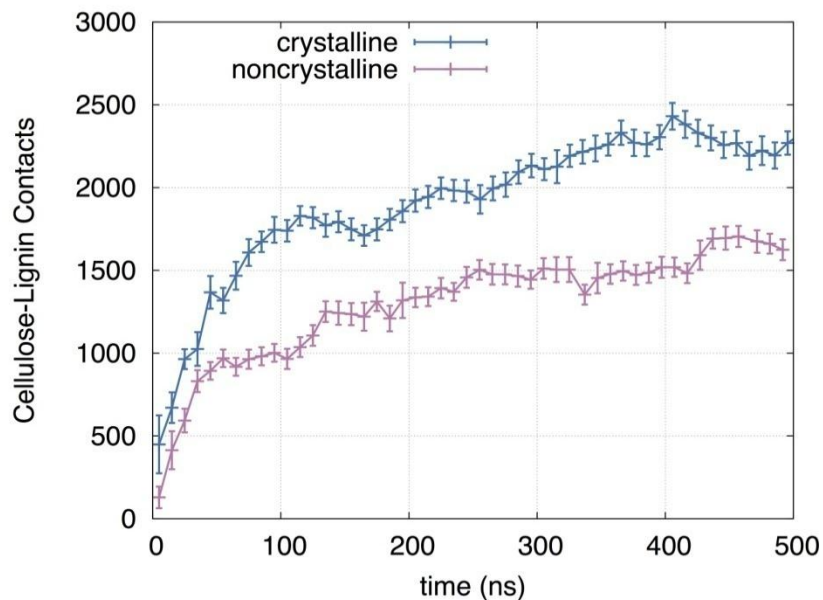
# DOE INCITE: Lignocellulose Simulation (30M cpu hours)



# Lignin Aggregation & Precipitation on Cellulose



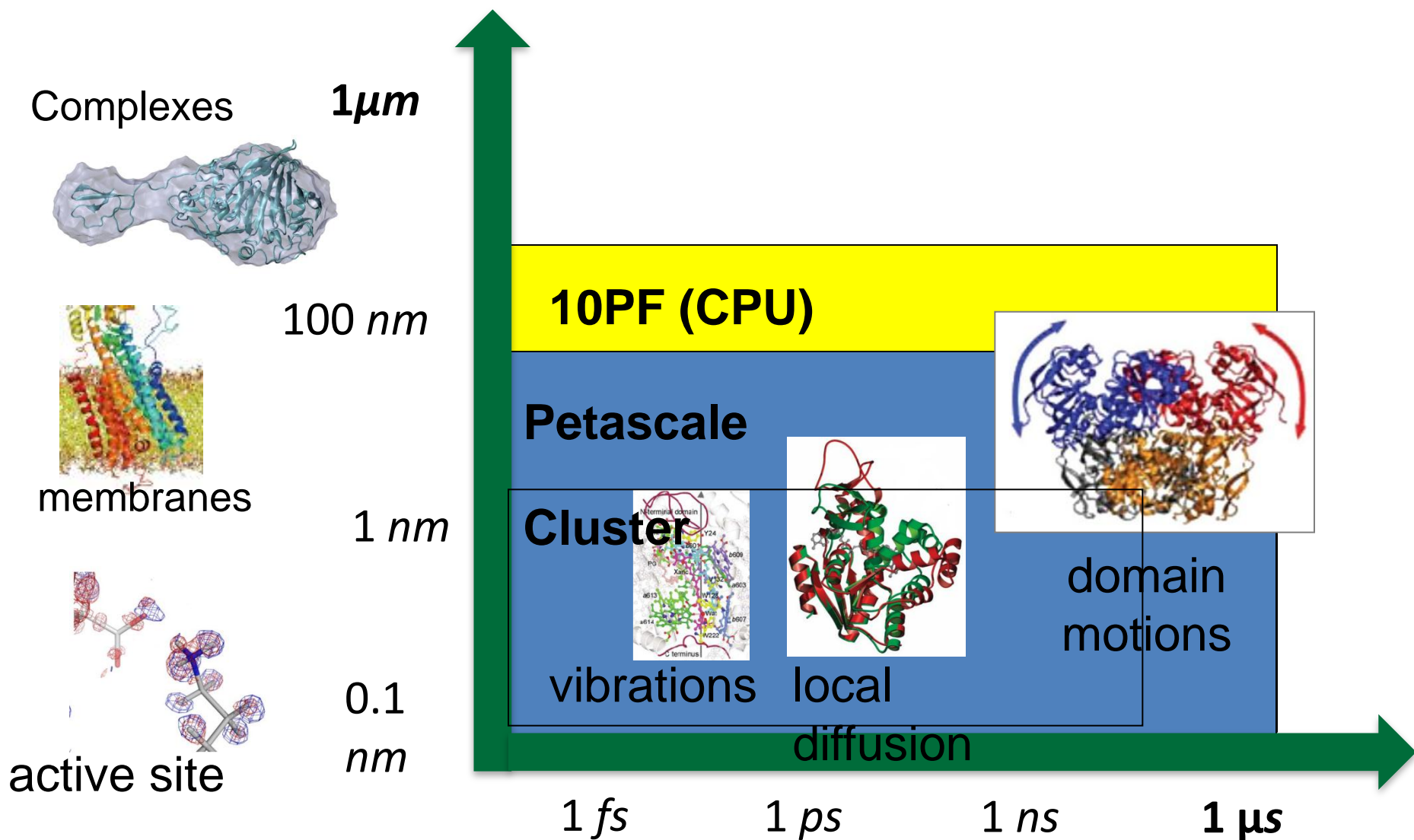




Interface	Interaction Energy Density (kJ/mol/nm <sup>2</sup> )
lignin: crystalline cellulose	-49±2
lignin: non-crystalline cellulose	-50±2
water : crystalline cellulose	-94±2
water : non-crystalline cellulose	-107±2

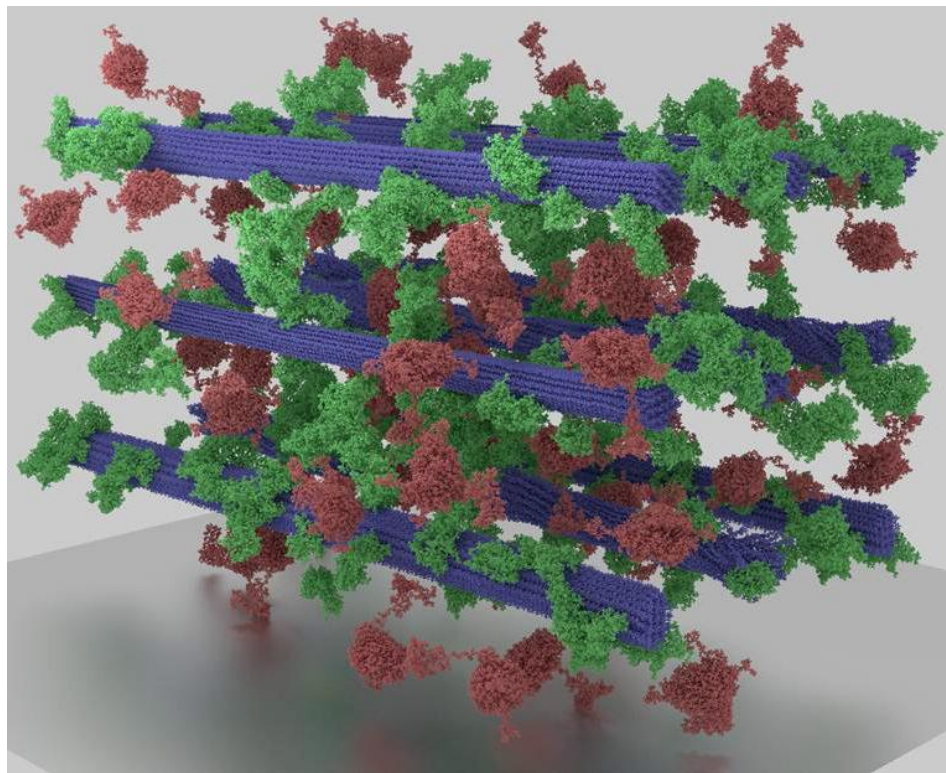
## Solvent-Driven Preferential Association of Lignin with Crystalline Cellulose

# Multiscale Structure and Dynamics

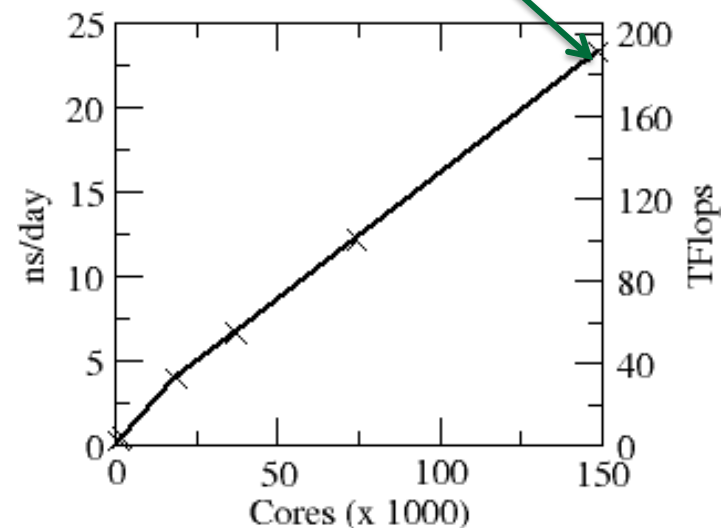
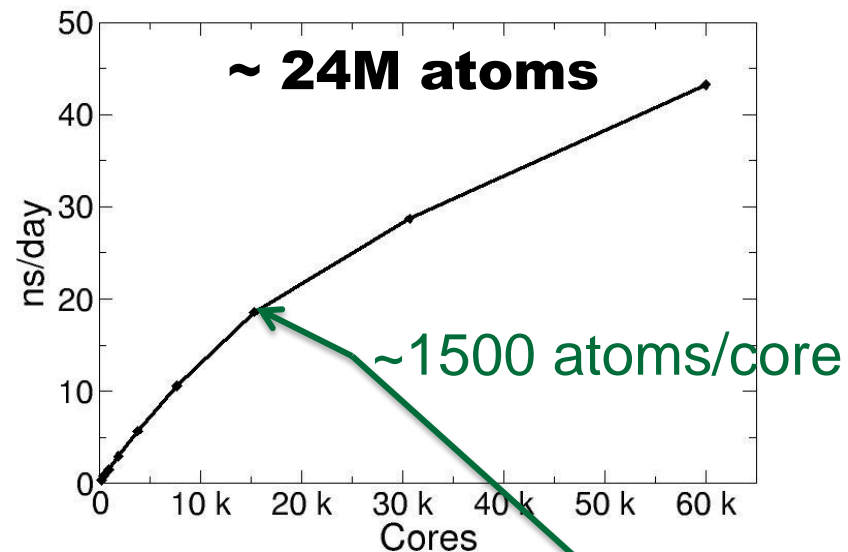


# CPU Strong Scaling

Roland Schulz



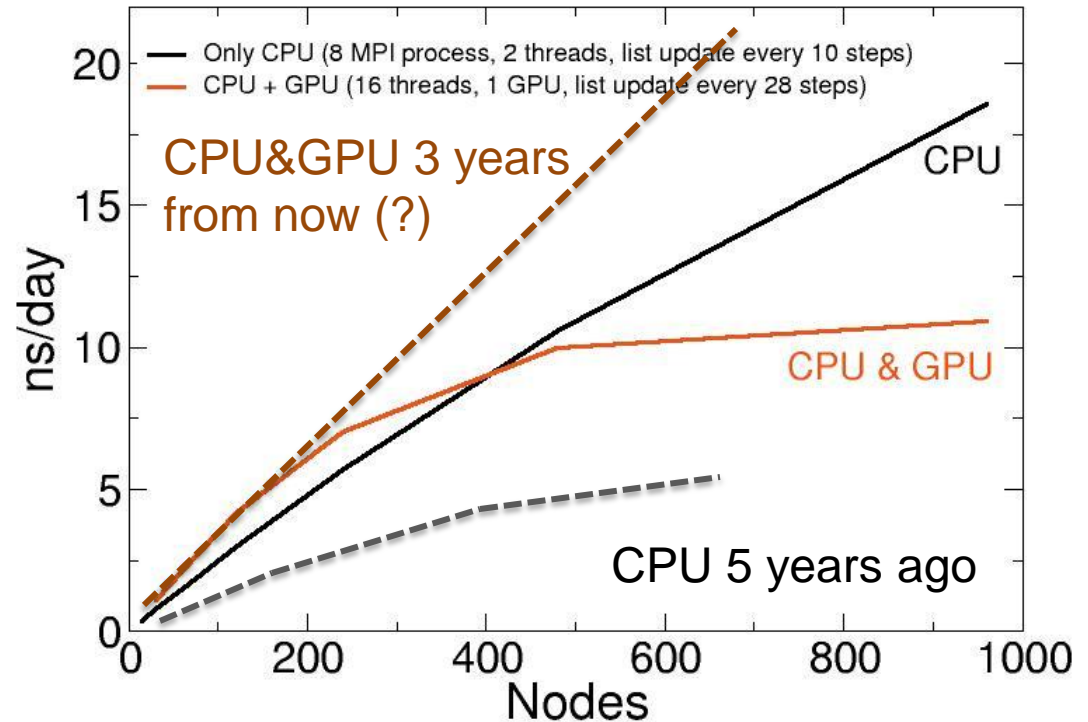
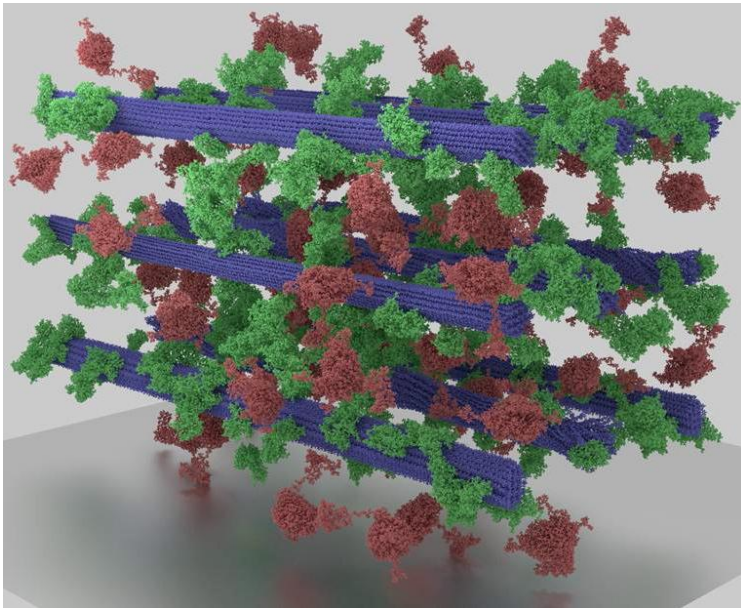
**24M-atom capability-class  
simulation of enzyme binding  
to pretreated lignocellulose**



**~ 100M atoms**

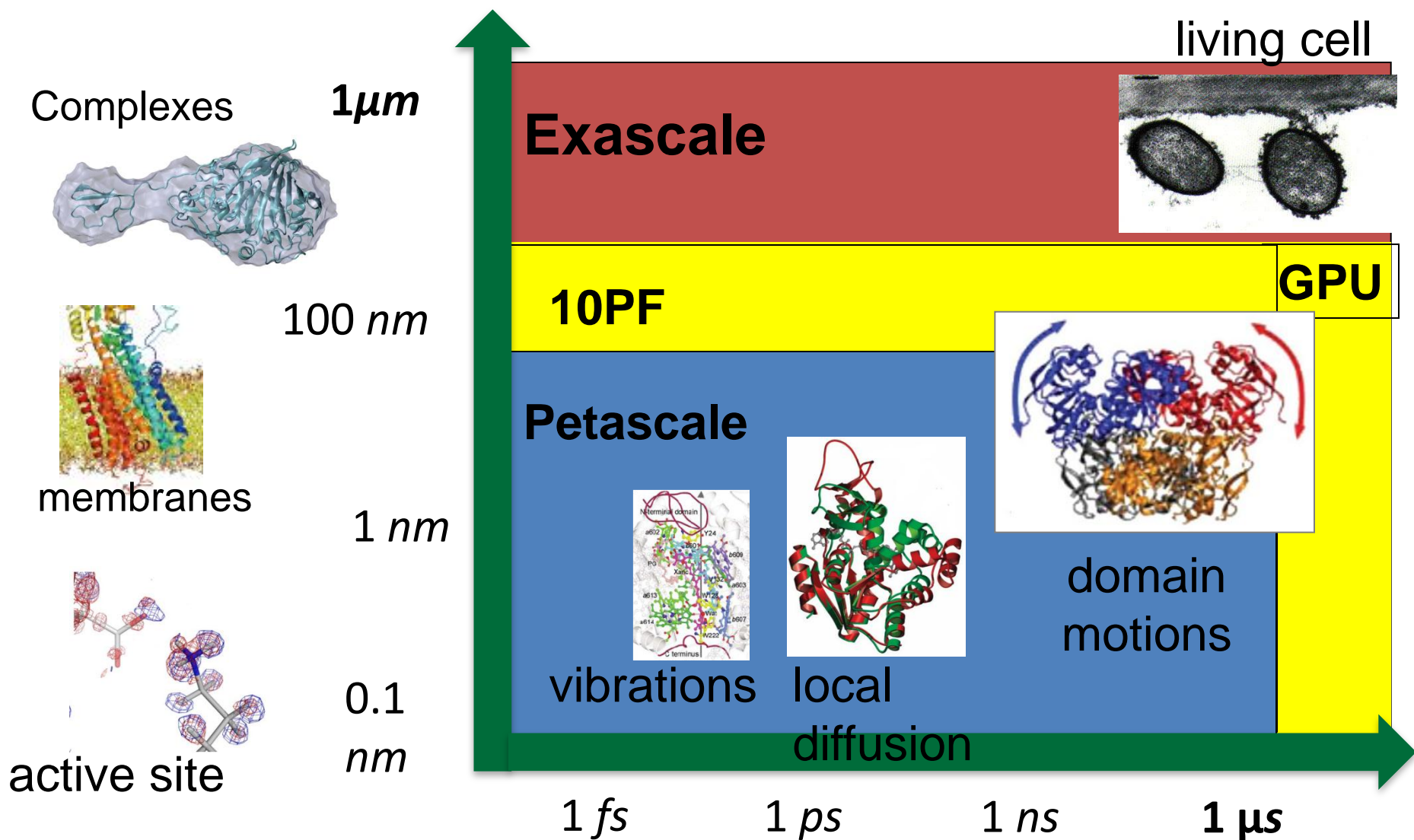
# GPU Scaling

Roland Schulz  
Szilard Pall  
Berk Hess





# Outlook





# Acknowledgements



Roland  
Schulz



Benjamin  
Lindner



Jeremy  
Smith

Venki Pingali  
Volker Urban  
William Heller  
Hugh O'Neill  
Barbara Evans

Paul Langan  
Brian Davison  
Marcus Foston  
Art Ragauskas

## Funding

DOE Office of Biological and Environmental  
Research



## Computational Resources

National Center for Computational Sciences  
DOE INCITE award from DOE Office of Science



Graphics: T. Splettstoesser and M. Matheson