



# Visualization of Biomolecular Structures: State of the Art

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#### **Authors**



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#### Introduction

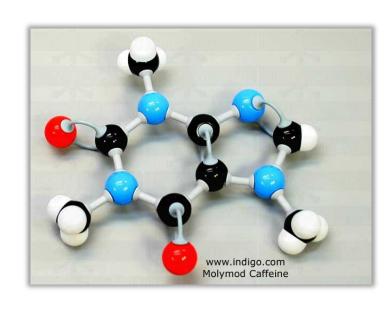
- Molecular visualization is one of the oldest branches of data visualization
  - Builds up on pre-computer era depictions and models of molecules
- Molecular visualization is a vast and diverse field of research
- → This STAR focuses on
  - Interactive 3D Visualization of
  - Biomolecules (DNA, proteins, lipids etc.) described by
  - Classical Models (no quantum effects, atoms depicted by hard spheres)



#### حريا ا

#### **Biomolecules 101**

- Molecules
  - Atoms (117 chemical element)
    - Protons and electrons
  - Bonds (e.g., covalent, disulfide, hydrogen)
- Small molecules & ions
  - Lipids (membranes)
  - Ligands/metabolites
  - Solvent molecules (e.g., water)
  - etc.



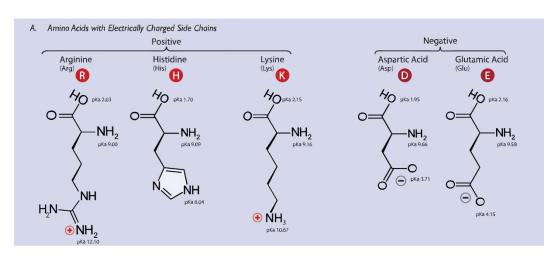
http://en.wikipedia.org/wiki/Phospholipid



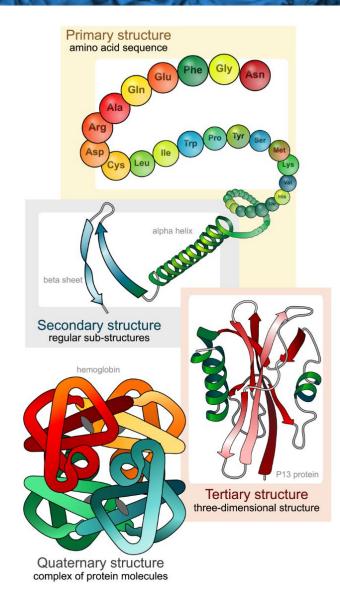


#### **Biomolecules 101**

- Proteins
  - Building blocks of the "machinery of life"
  - Consists of amino acids
    - One or more linear chains of amino acids that form a functional complex
  - Secondary Structure (helix, sheet, turn, coil)



http://en.wikipedia.org/wiki/Amino\_acid

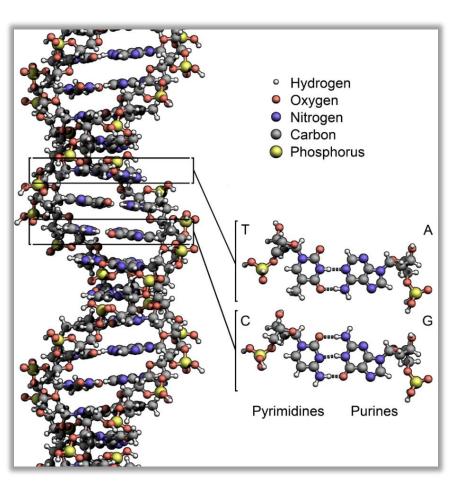


http://en.wikipedia.org/wiki/Protein\_structure



#### **Biomolecules 101**

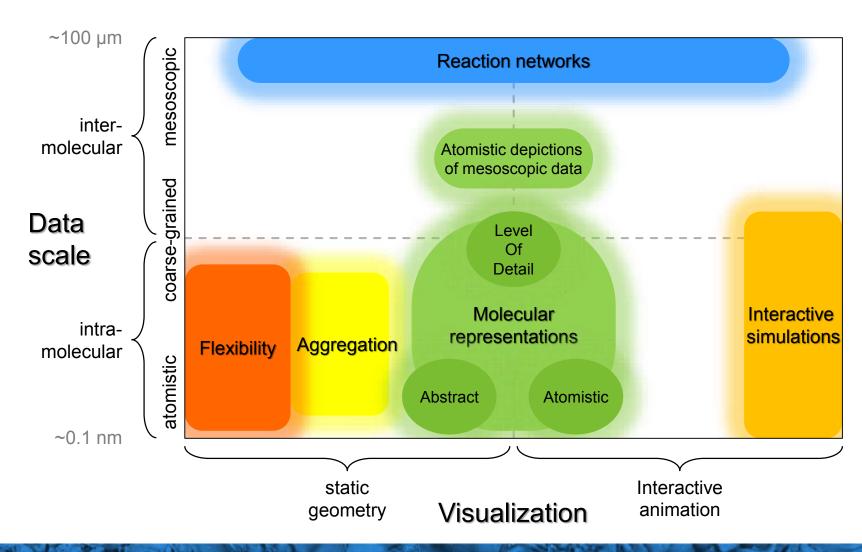
- DNA & RNA
  - DNA stores the "genetic code"
    - Blueprint for proteins
  - Chain of nucleotides
    - Sugar backbone (Desoxy-/Ribose)
    - Phosphate
    - Nucleobase
      - cytosine, guanine, adenine, thymine/uracil)
    - 3 nucleotides encode 1 amino acid



http://en.wikipedia.org/wiki/DNA

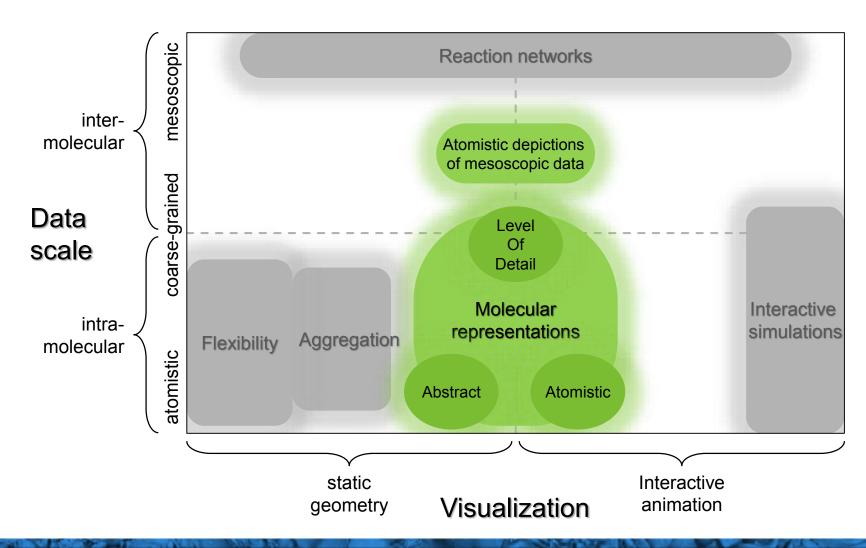


#### **Taxonomy**











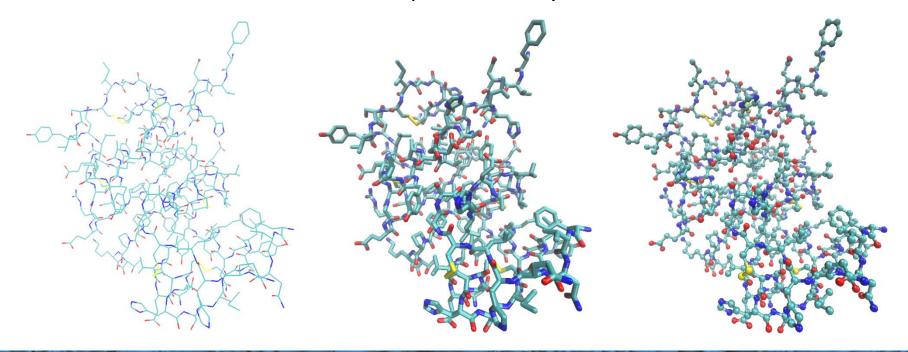
# **Molecular Representation Models**

- Atomistic Representations
  - Bond-centric Models
  - Surface Models
- Abstract and Illustrative Representations
  - Representations of Molecular Architecture
  - Surface Abstractions
- Structural Level of Detail



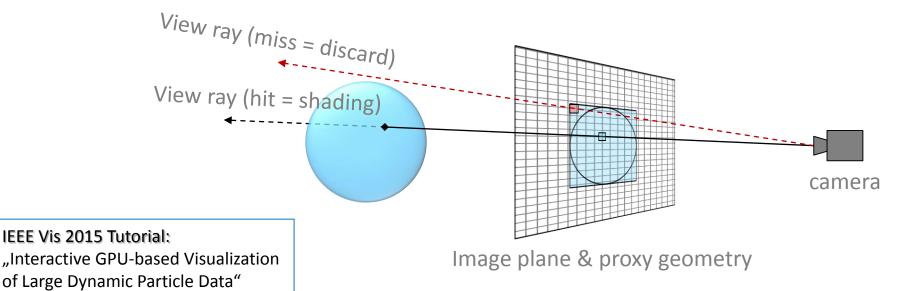
# **Atomistic Representations**

- Molecular models that show the position of the atoms
- Bond-centric Models
  - Bonds define the topology of the molecule
  - Lines, Stick, Ball-and-Stick → spheres and cylinders



# **GPU-based Glyph Ray Casting**

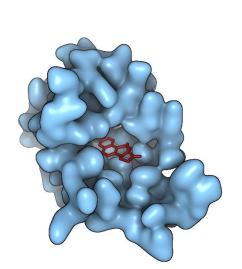
- State-of-the-art for rendering implicit objects
  - Upload implicit description of object to GPU
  - Proxy geometry that covers the object in Vertex/Geometry Shader
  - Object/ray intersection in Fragment Shader
    - Analytical solutions for low polynomial order (≤4) → spheres, cylinders, tori,...



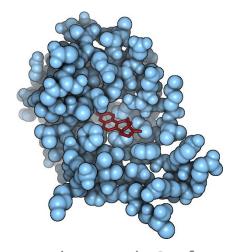


#### **Molecular Surfaces**

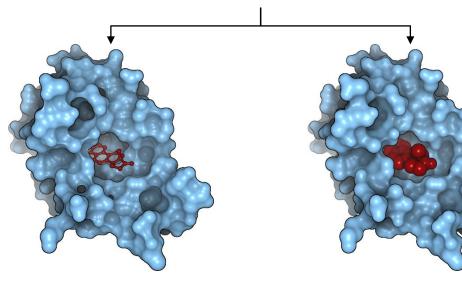
- Show molecular properties
- Depict boundary



Gaussian Surface (Metaballs)



van der Waals Surface



Solvent Excluded Surface

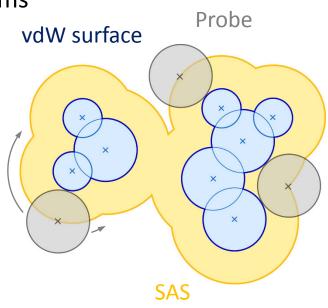
Ligand Excluded Surface





#### Van der Waals and Solvent Accessible Surface

- Van der Waals (vdW) surface
  - vdW radius: distance between non-bonded atoms
  - Molecular volume
  - Does not consider ligands or solvent molecules
- Solvent Accessible Surface (SAS)
  - Surface with respect to a certain solvent radius
    - Interior not reachable by solvent
  - Theory: Rolling probe (radius r<sub>p</sub>)
  - Practice: Inflation of vdW radius by r<sub>p</sub>
- Rendering via GPU ray casting

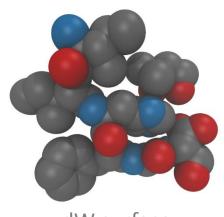




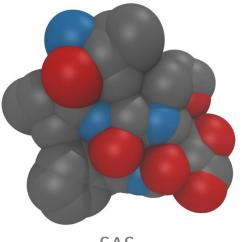


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vdW surface

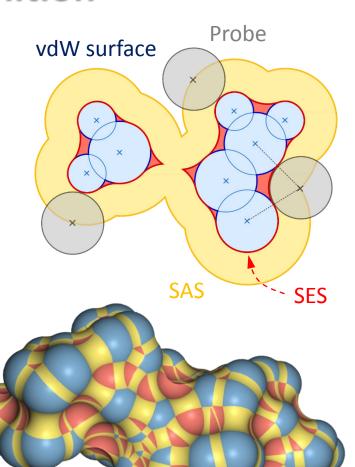


SAS



#### **Solvent Excluded Surface – Definition**

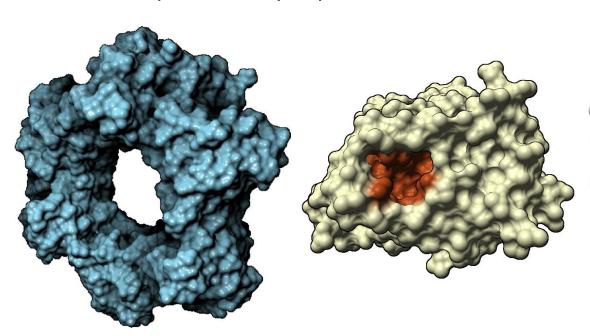
- Defined by rolling probe of radius r<sub>p</sub>
  - Probe surface traces out SES
- Smooth, tight surface
  - Boundary with respect to solvent
  - No inflation (molecular volume is preserved)
- Three types of patches
  - Concave spherical triangles
  - Convex spherical patches
  - Saddle-shaped toroidal patches
- Parallel computation
  - Interactive for 100k atoms
  - CPU [Lindow et al. 2010] or GPU [Krone et al. 2011]







- GPU ray casting of patches
- Implicit description [Parulek et al. 2012]
  - Direct ray casting via sphere tracing
  - Computationally expensive



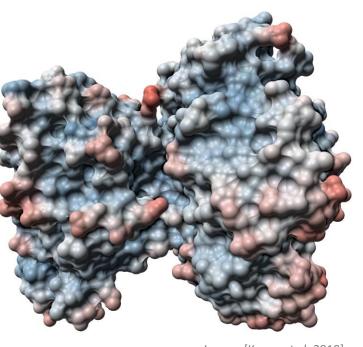
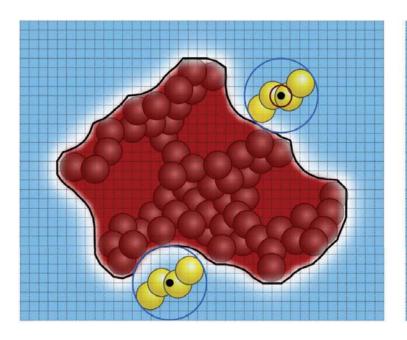


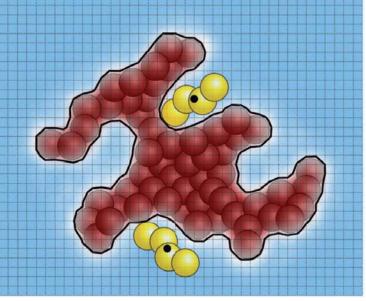
Image: [Krone et al. 2010]



# **Ligand Excluded Surface – Definition & Rendering**

- Recent extension of the SES [Lindow et al. 2014]
  - Shows a more accurate contact surface with respect to a specific ligand
- No analytic computation (yet?)
  - Computationally expensive, grid-based sampling method

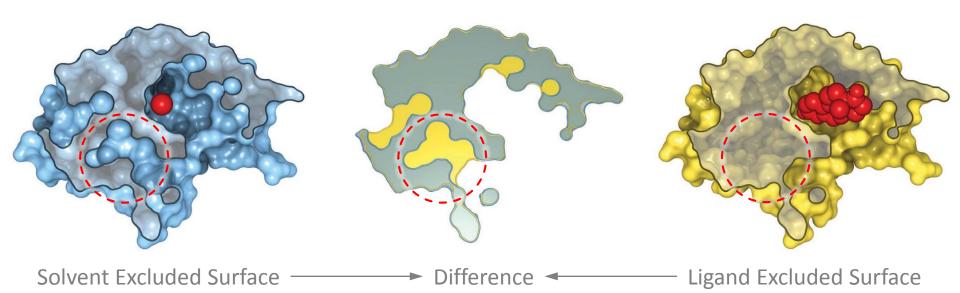






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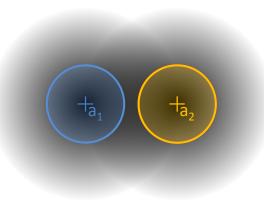
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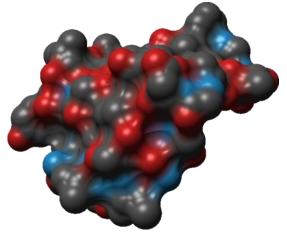


#### **Gaussian Surfaces – Definition**

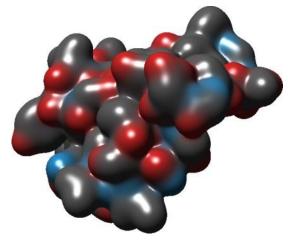
- Defined in 1982 by Jim Blinn (aka Metaballs/Convolution Surfaces)
  - Sum of Gaussian radial basis function for each atom ( $\Rightarrow$  density field in  $\mathbb{R}^3$ )
  - Model electron density
  - Isosurface can approximate SES (surface shape and surface area)



Two atoms with radial symmetric Gaussian density kernels



SES



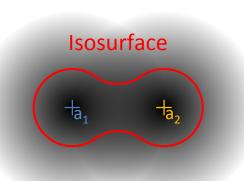
Gaussian surface

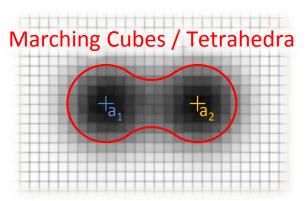
Images: [Krone et al. 2012]

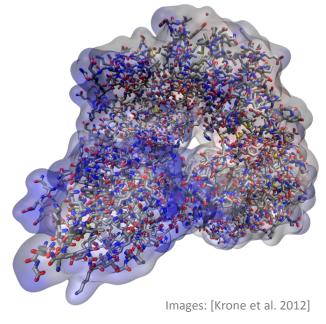




- Interactive Rendering
  - Direct ray casting using depth peeling (~1M atoms) [Kanamori et al. 2008]
  - Grid-based sampling of the density (GPU-parallelized: ~10M atoms)
    - Isosurface extraction via Volume Ray Marching or Marching Cubes/Tetrahedra

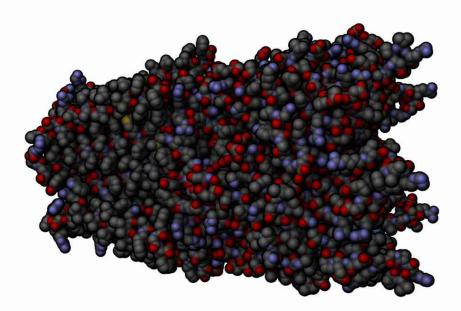








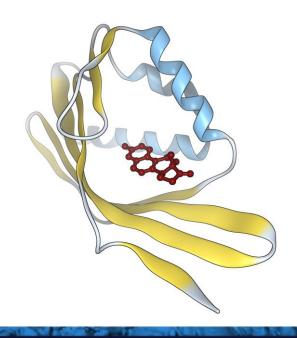
- Representations of Molecular Architecture
  - Show functional structure (derived from atom positions)
  - Cartoon Representation for DNA and proteins
    - Seamless transition [van der Zwan et al. 2011]

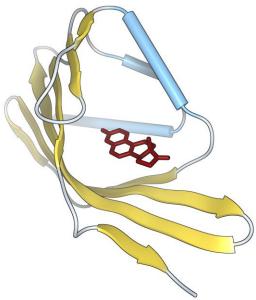


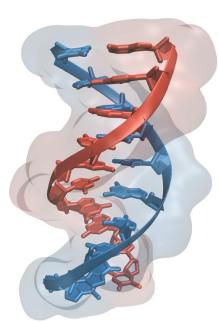
http://tobias.isenberg.cc/VideosAndDemos/Zwan2011IMV



- Cartoon Rendering
  - Complex shapes → no ray casting
  - GPU-acceleration polygonal rendering
    - Vertex shader [Wahle et al. 2011]
    - Geometry shader [Krone et al. 2008]



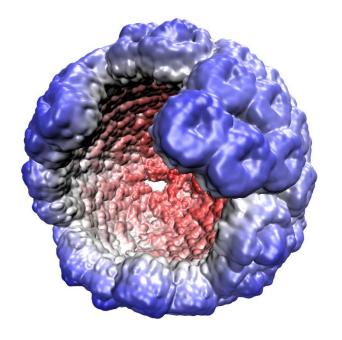


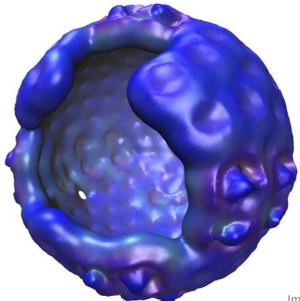






- Surface Abstractions
  - Coarsening of Gaussian surfaces (LoD, bounding spheres) [Krone at al. 2012]
  - Smoothing of high-frequency surfaces like SES [Cipriano, Gleicher 2007]
  - Mapping of molecular surface to a sphere (e.g., [Rahi, Sharp 2014])

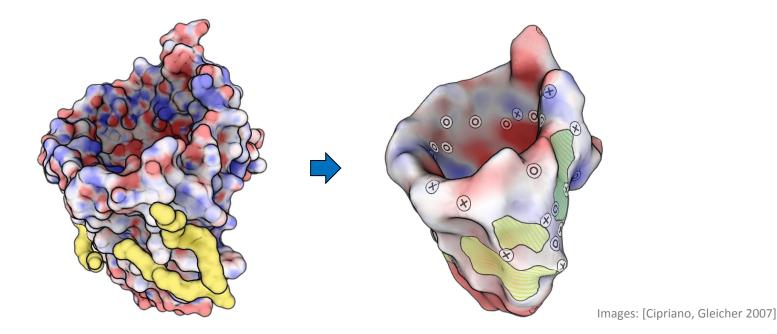




Images: [Krone et al. 2012]



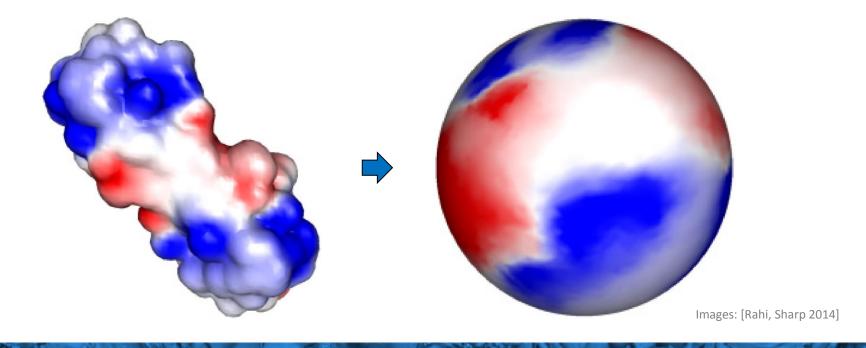
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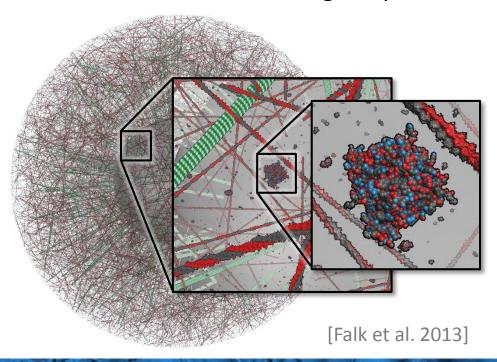


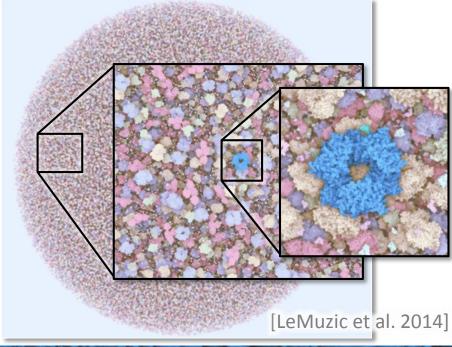
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#### **Structural Level of Detail**

- Derive all-atom representation from coarse-grained simulations
  - Cellular environment → Many instances of the same molecules
  - Special GPU-accelerated rendering methods
  - Interactive rendering of up to 10 billion particles



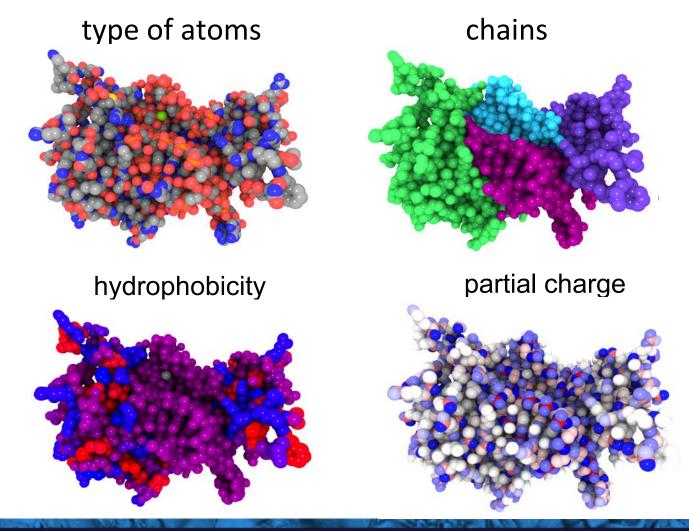


# **Molecular Rendering**

- Enhances
  - Image quality
  - Perception of geometric shapes and depth complexity
- Achieved by
  - Shading
  - Depth cues
- Computable for dynamic data in real-time

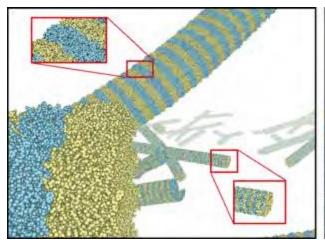


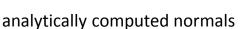


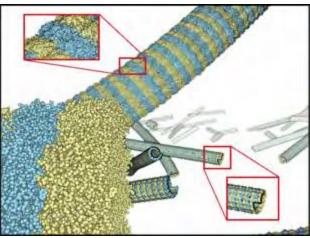


#### Illumination

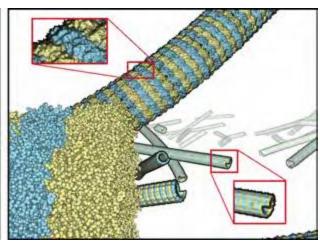
- Phong and Blinn-Phong
   Specular highlights create artifacts
- Normal correction scheme based on deferred shading







deferred shading [Grottel et al. 2010]



deferred shading [Lindow et al. 2012]

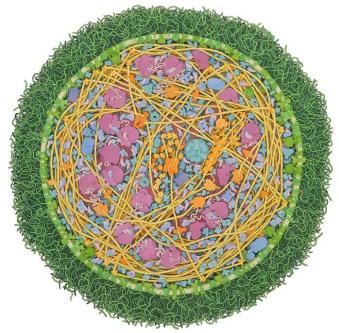
Images: [Lindow et al. 2012]



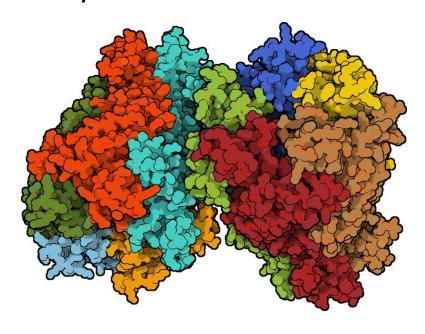


# **Cel Shading**

- Artistic or non-photorealistic renderings with a comic-like look
- Resembles hand-drawn illustrations by David Goodsell



Mycoplasma cell [Goodsell]

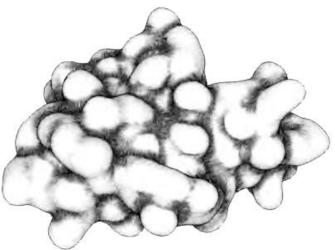


B-Raf protein rendered in MegaMol [Grottel et al. 2015]

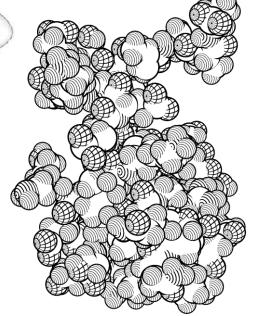




#### Feature lines and hatching



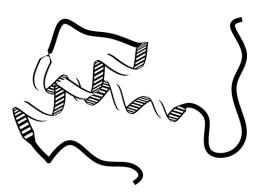
molecular surfaces [Lawonn et al. 2014]



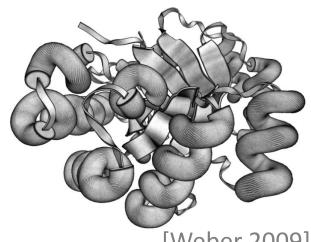
space filling models

[van der Zwan et al. 2011]

[van der Zwan et al. 2011]



cartoon representations







# **Depth Cue Techniques**

- Sihouettes, halos, depth darkening
- Ambient Occlusion
   Real-time Ambient Occlusion
- Depth of Field





# **Ordinal Depth Cues**

**Silhouettes** 

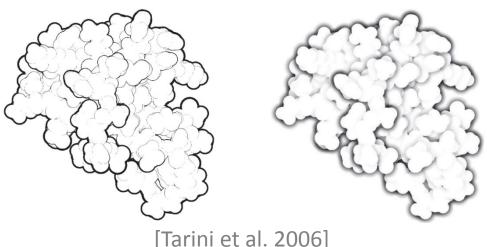
Computed in image space in postprocessing

Halos

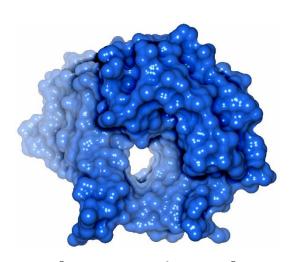
Extended from the object boundaries

**Depth darkening** 

Visually separates distant overlapping objects





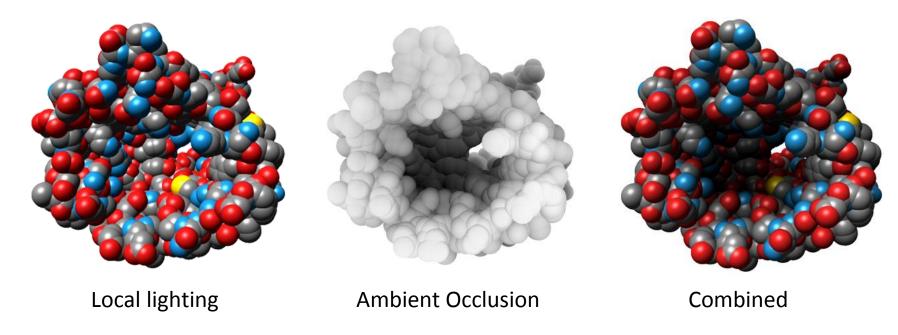


[Krone et al. 2009]



# **Relative Depth Cues – Ambient Occlusion**

- Mimicking the transport of diffuse light between objects
- Local shadowing, increases depth perception

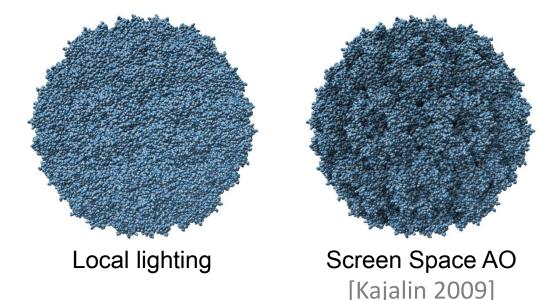


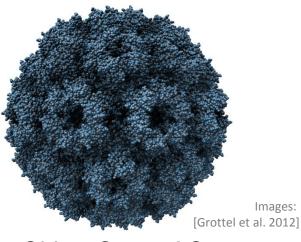
Computationally expensive, accelerated approaches developed



#### **Real-time Ambient Occlusion**

- Screen-Space Ambient Occlusion
  - Image space technique, approximates the effects in postprocessing
  - Considers the visible neighborhood of fragments
- Object-Space Ambient Occlusion
  - Considers the entire local neighborhood of atoms





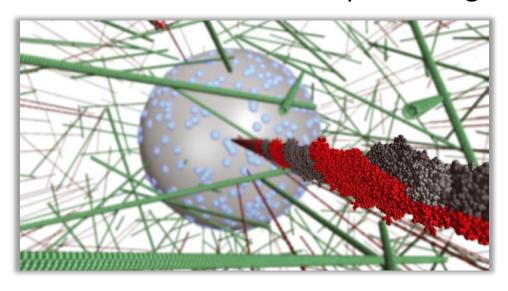
Object Space AO [Grottel et al. 2012]



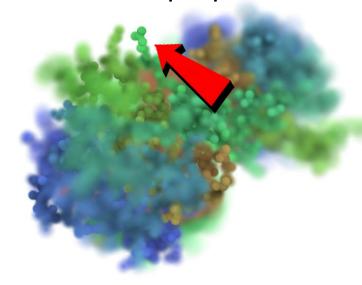


# **Depth of Field**

- Separating foreground from background
- Image-space and object-space based approaches
- Draw the attention to a specific region or semantic properties



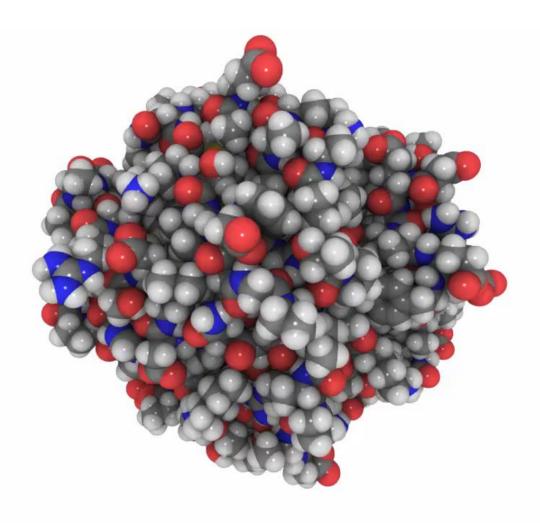
Region-based [Falk et al. 2013]



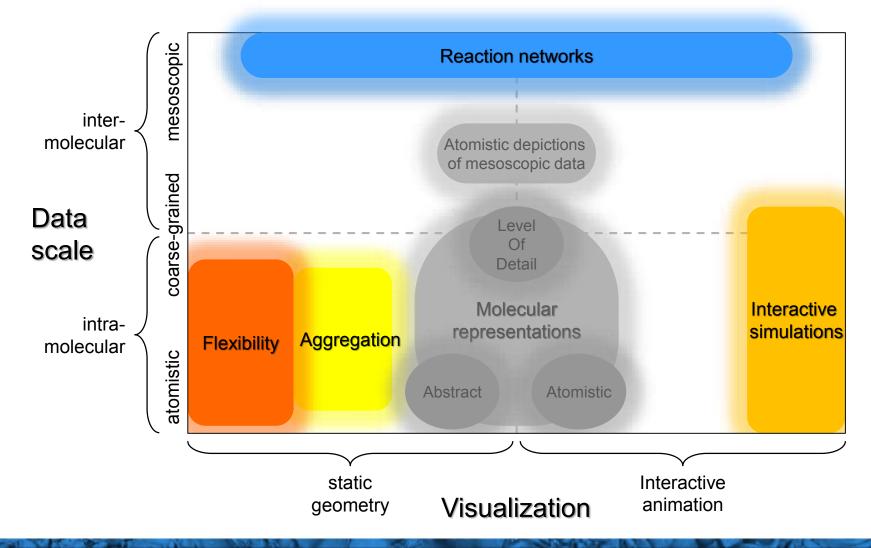
Semantic-based [Kottravel et al. 2015]



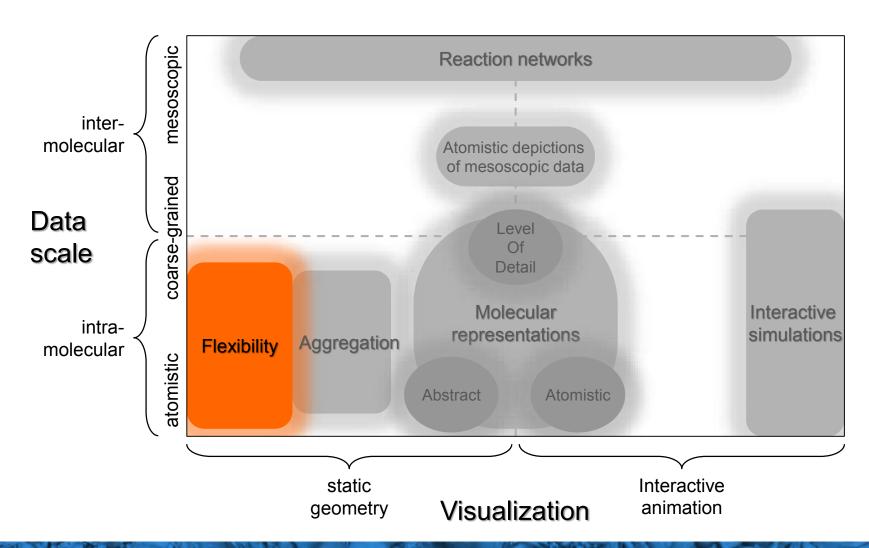
## **Visualization of Molecular Dynamics**



## **Visualization of Molecular Dynamics**





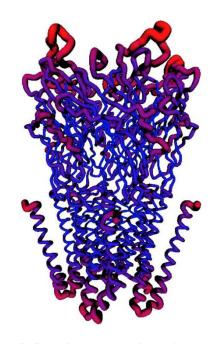




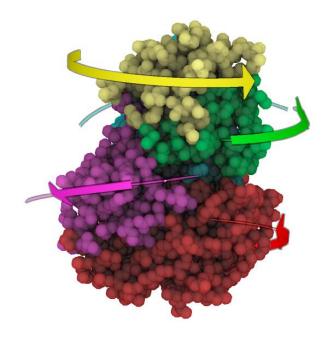


## **Visualization of Flexibility**

Probability distribution depicting the varying molecular conformations

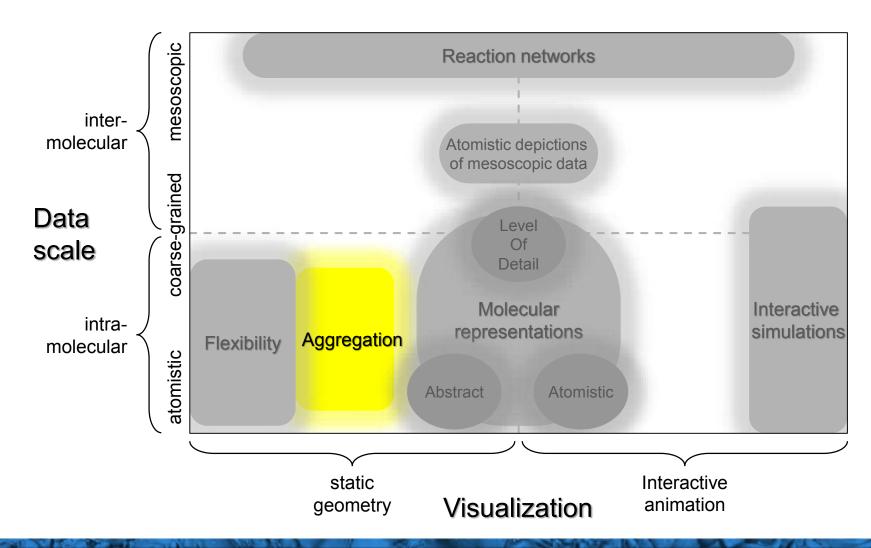


Modulated tube [Lv et al. 2013]



Normal Mode Analysis [Bryden et al. 2012]



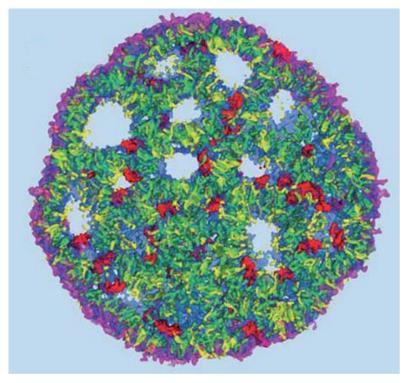




## **Aggregation**

#### Spatial

Aggregating atom densities using property grids



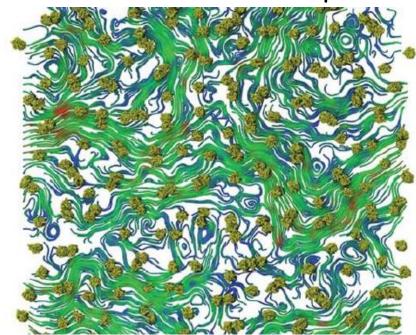
[Rozmanov et al. 2014]



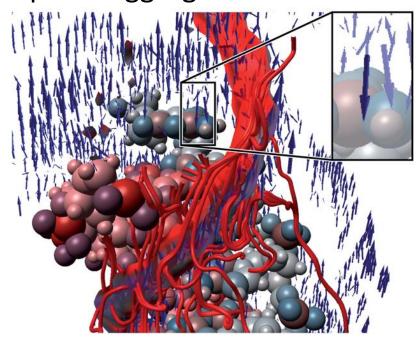
## **Aggregation**

#### Temporal

- Aggregated diffusional motion
- Combination of temporal and spatial aggregation



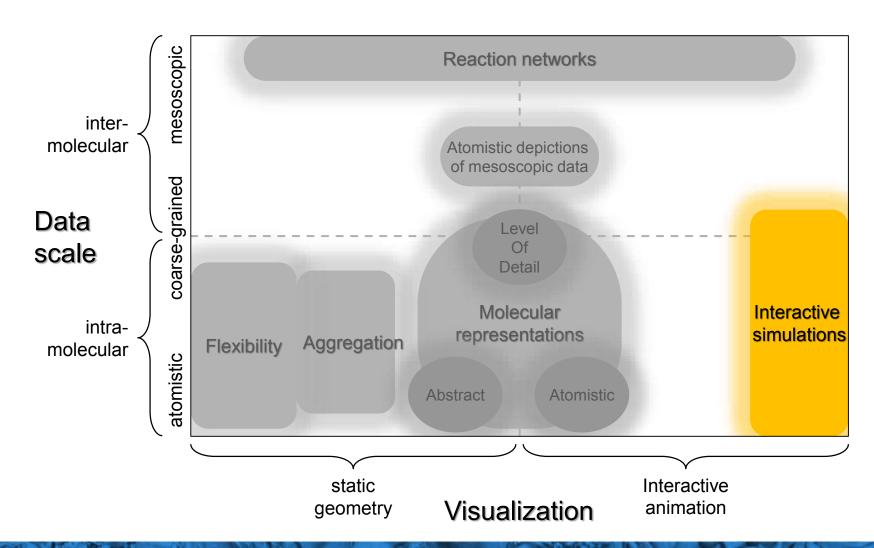
[Chavent et al. 2014]



[Ertl et al. 2014]







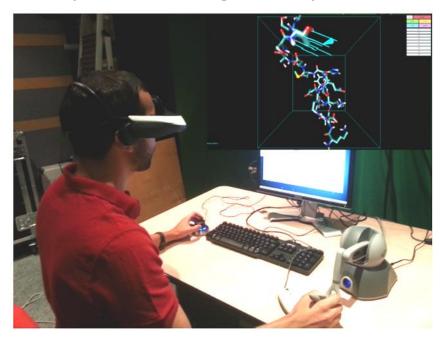




#### **Interactive Simulations**

- Visualization has to be interactive → simulation performance has to be the limiting factor
- Haptic rendering 1000 Hz refresh rates
- Cheaper and better hardware → haptic steering is very attractive

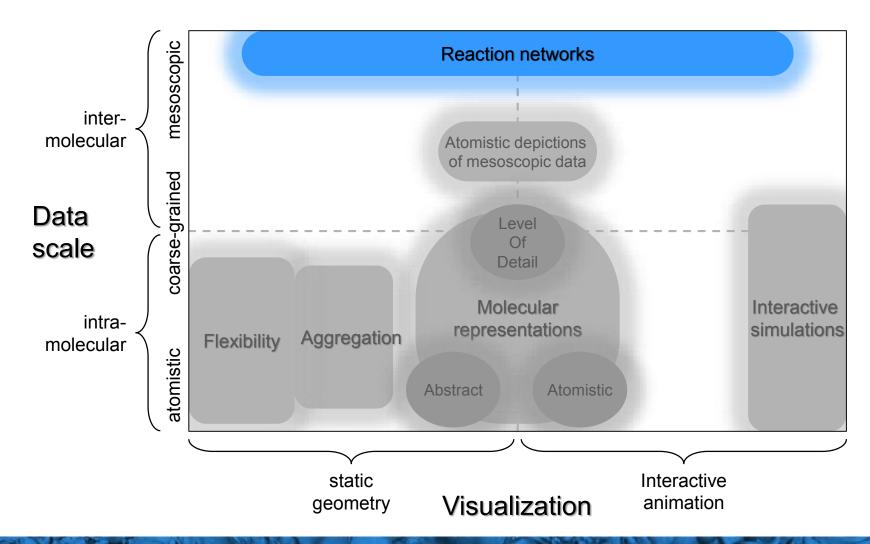
Applied to systems with more than 1 million atoms



[Dreher et al. 2013]



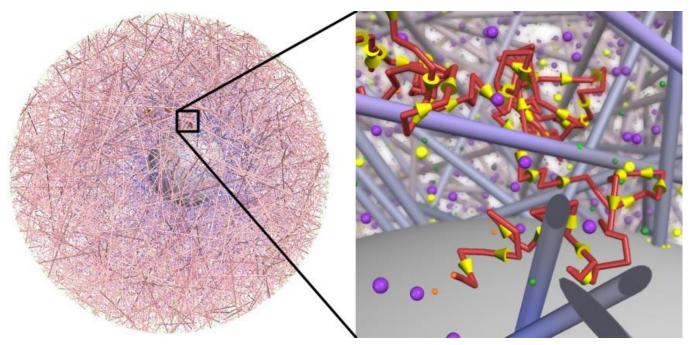
## **Taxonomy**





### **Visualization of Molecular Reactions**

- Several existing tools for the visualization of reaction networks
- Particle simulations are very crowded
   Methods visually emphasizing interesting aspects of simulations

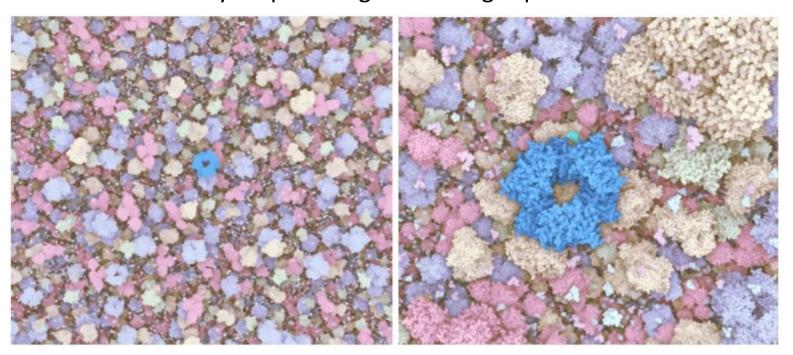


particle trajectory [Falk et al. 2009]



#### **Visualization of Molecular Reactions**

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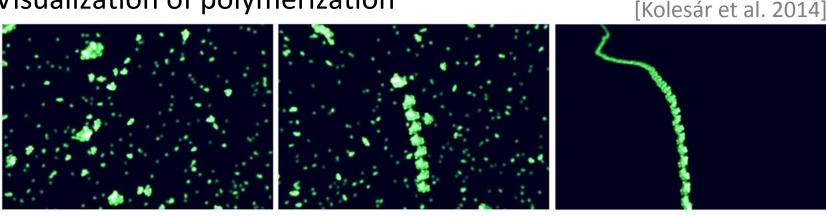


focus on reactions [Le Muzic et al. 2014]

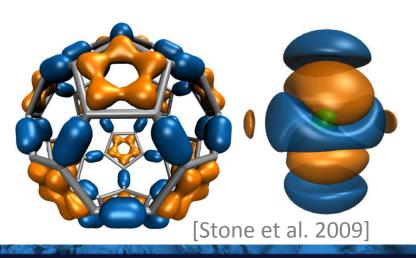


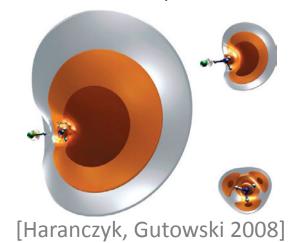
#### **Visualization of Molecular Reactions**

Visualization of polymerization



Visualization of molecular orbitals, electron densities, bonds





## **Molecular Visualization Systems**

- Most commonly used and robust systems incorporating the mentioned techniques
- Categorization into three groups





- Most commonly used and robust systems incorporating the mentioned techniques
- Categorization into three groups

















- Most commonly used and robust systems incorporating the mentioned techniques
- Categorization into three groups



Open-source prototype tools





















- Most commonly used and robust systems incorporating the mentioned techniques
- Categorization into three groups



- Open-source prototype tools
- Commercial systems















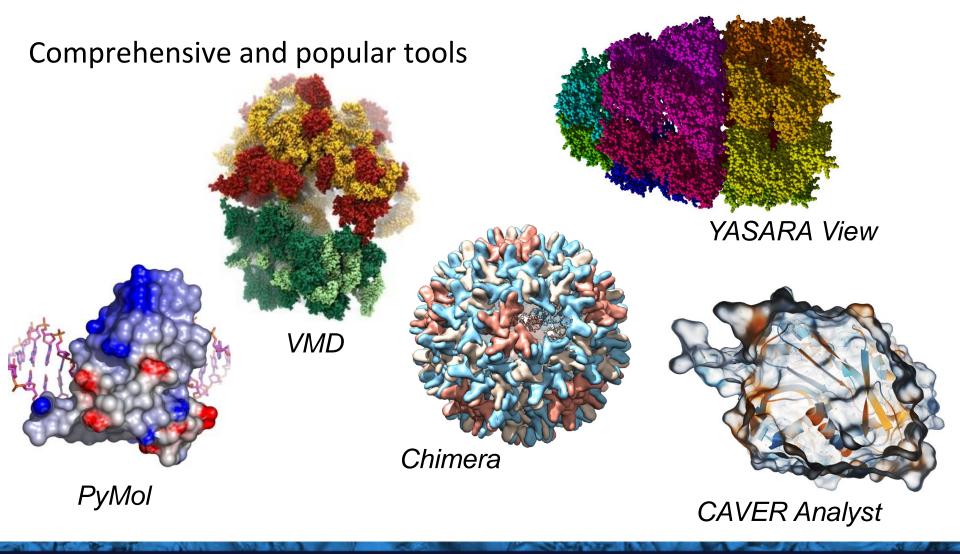








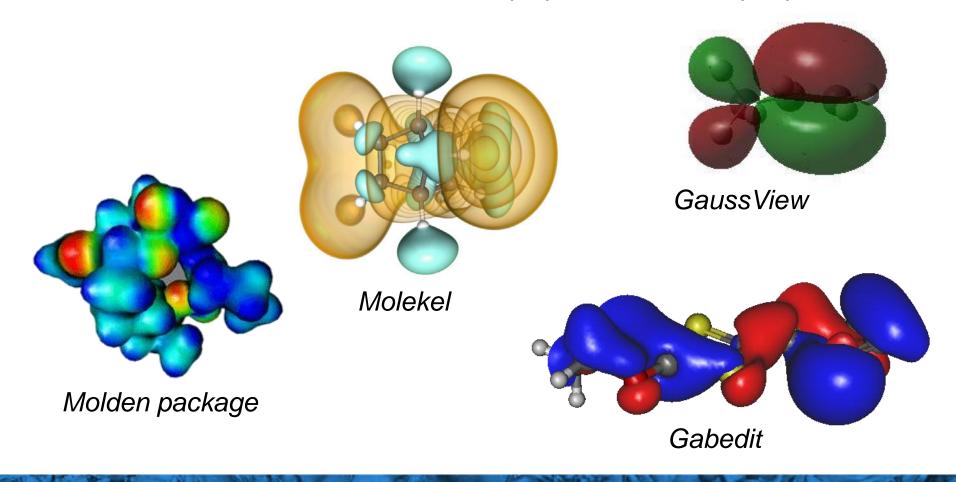
## **Freely Available Complex Systems**





## **Freely Available Specialized Systems**

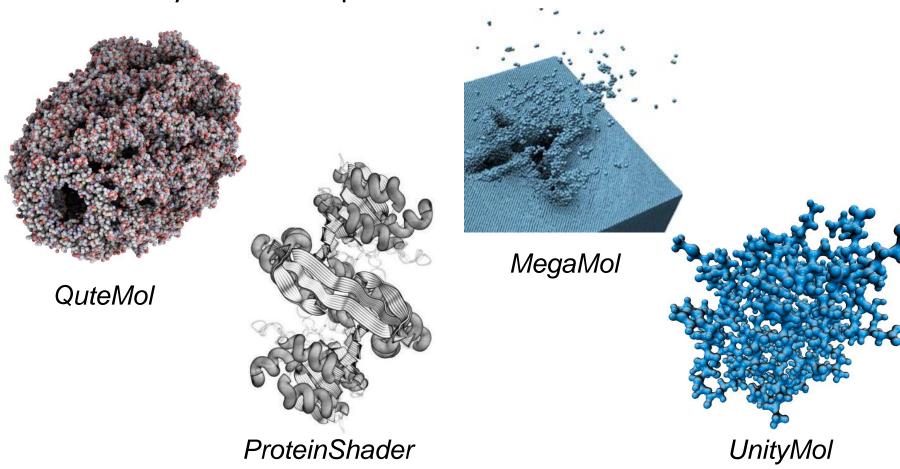
Stand-alone tools for visualization of physico-chemical properties



#### .

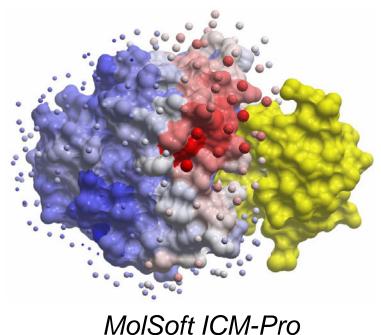
## **Open-Source Prototype Tools**

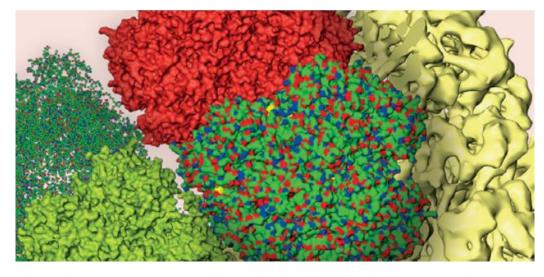
Focus on very efficient implementation



# **Commercial Systems**

Classical representations, iso-surfaces, volume rendering





**Amira** 

## **Future Challenges**

- Recent trend is to use GPU based rendering and computations
   Programmable GPUs and multi-core GPUs enable parallelization
- Increasing amount of captured data sets in terms of particle numbers and time steps
- Complexity of data will require new visual representations
   Visual analysis
- Quantum mechanics simulations will require novel visualization methods
- Interactive ray tracing
- Visual language for biomolecules

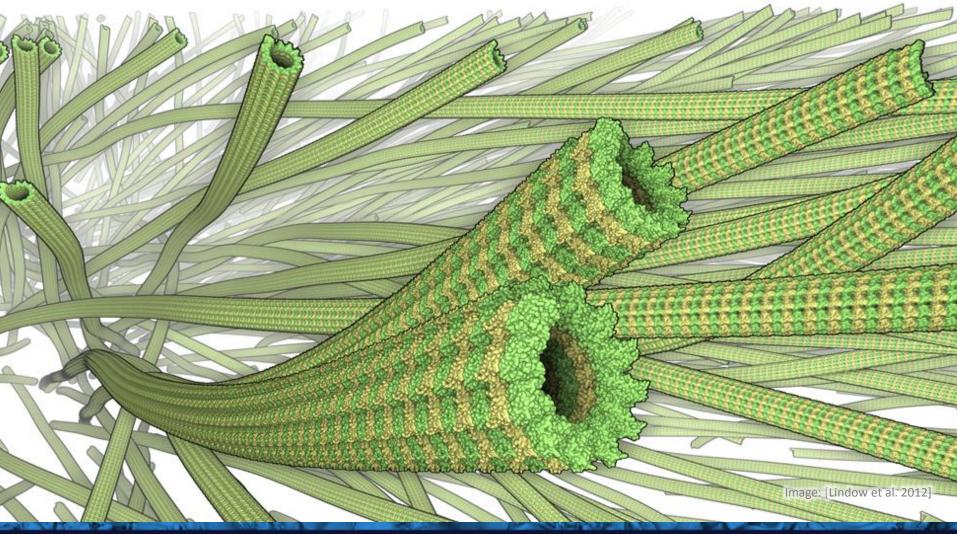


### **Conclusion**

- Different representations coming from a diverse field of molecular biology
- There is not one best representation but rather many possible ones, each one best suited for a specific task



## **Thank you for your Attention**





[Goodsell] Molecular Art | Molecular Science, Home of David S. Goodsell http://mgl.scripps.edu/people/goodsell/

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