

# Uncertainty Classification of Molecular Interfaces

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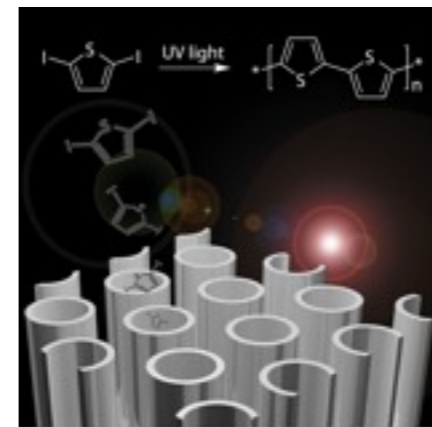
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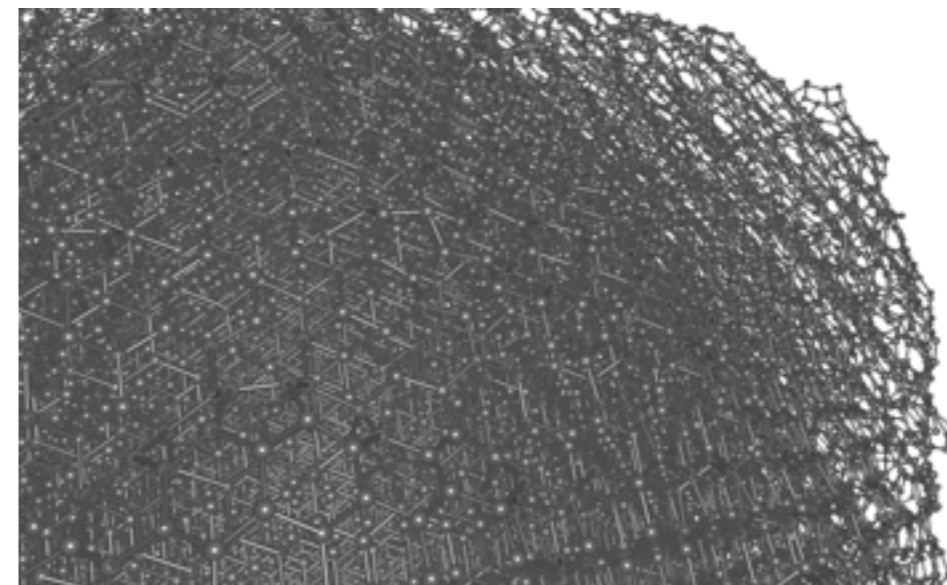
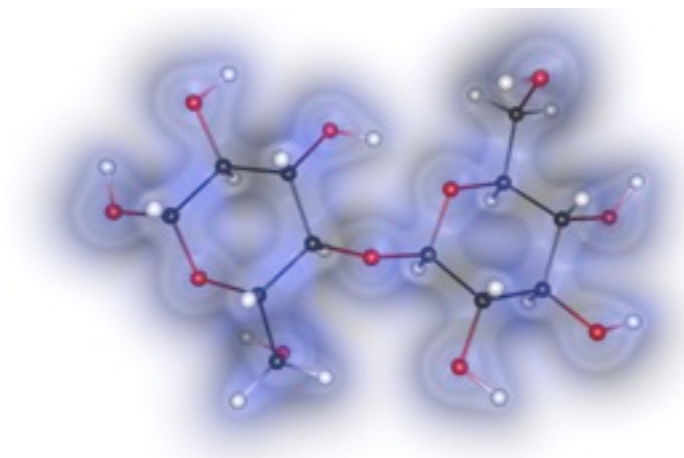
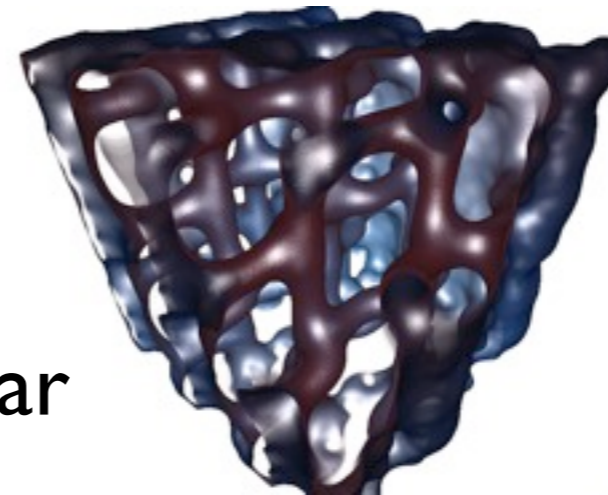
# Motivation

- Computational chemistry drives **new energy science**.
- catalysis, diffusion, oxidation, heat/energy transfer, structure
- battery, photovoltaic, synthetic & biofuels, biomass conversion
- vis, analysis needed for MD, DFT
  - materials data have special needs.



# Challenges in molecular vis

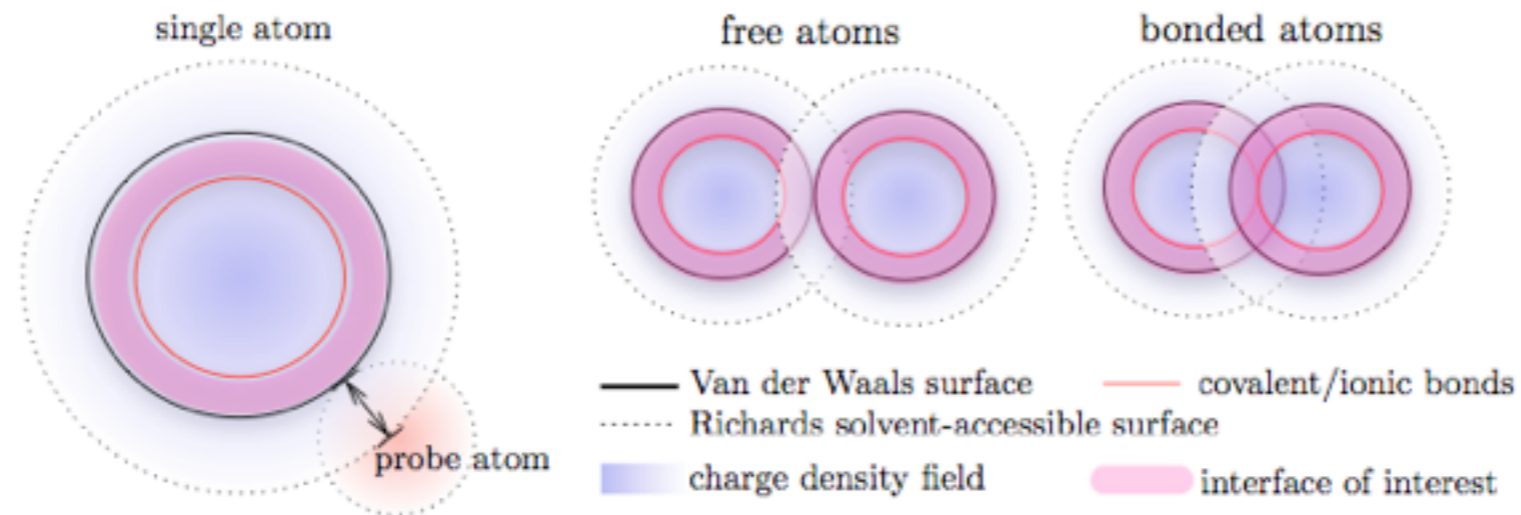
- How do we represent molecular surfaces?
- How do we interpret electron density fields computed from DFT?
- How do we visualize macromolecules?



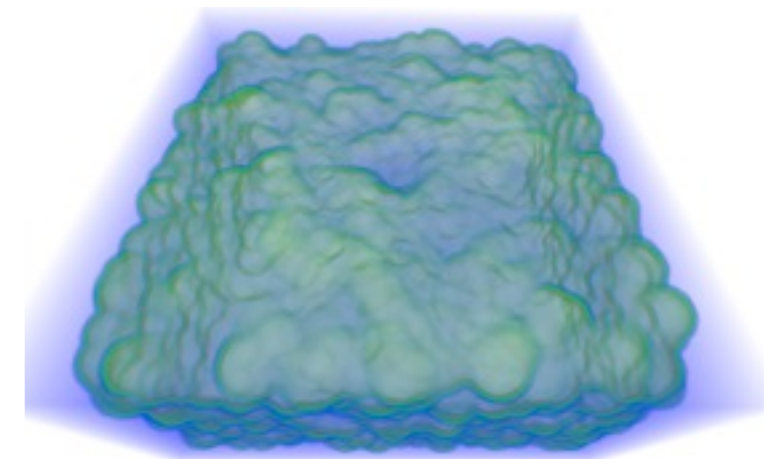
# Scientific background

- Molecular structure is continuous:  
Self-consistent field (SCF) theory
- Schroedinger Equation  $E\psi = H\psi$
- LCAO DFT  $\theta_{nlm}(r, \theta, \phi) = R_{nl}(r)Y_{lm}(\theta, \phi)$
- Density Functional Theory (**DFT**): simulate electrons
  - chemical bonds, activation energy
- Molecular Dynamics (**MD**): simulate atoms
  - intermolecular forces, heat, diffusion

# Atomic radii

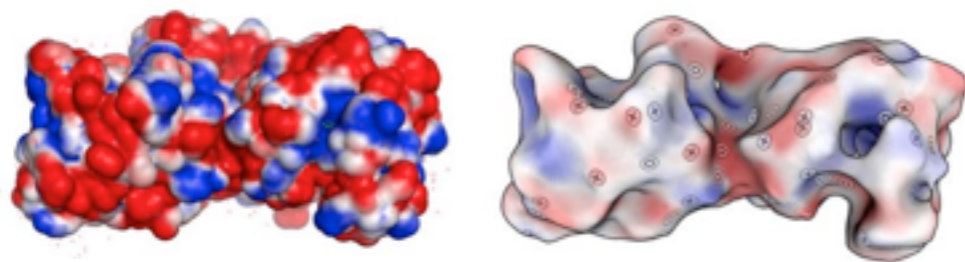
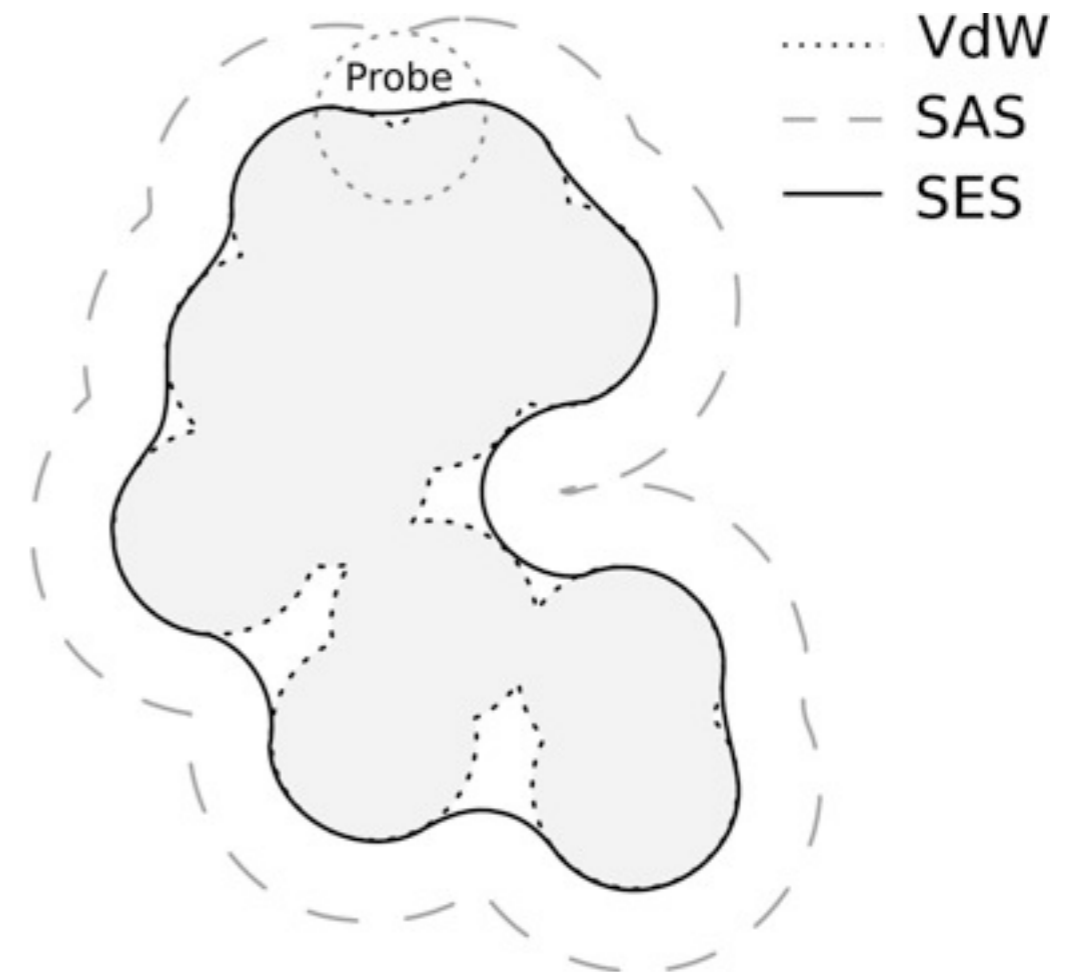
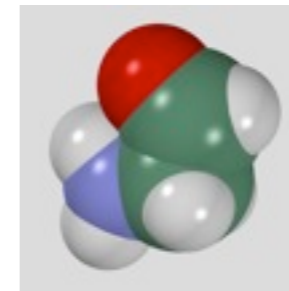


- Van der Waals radius = half the distance between *free* atoms.
- Chemical bond radii
  - covalent, ionic, metallic
- In practice, “surfaces” exist inside VDW radius



# Molecular surfaces

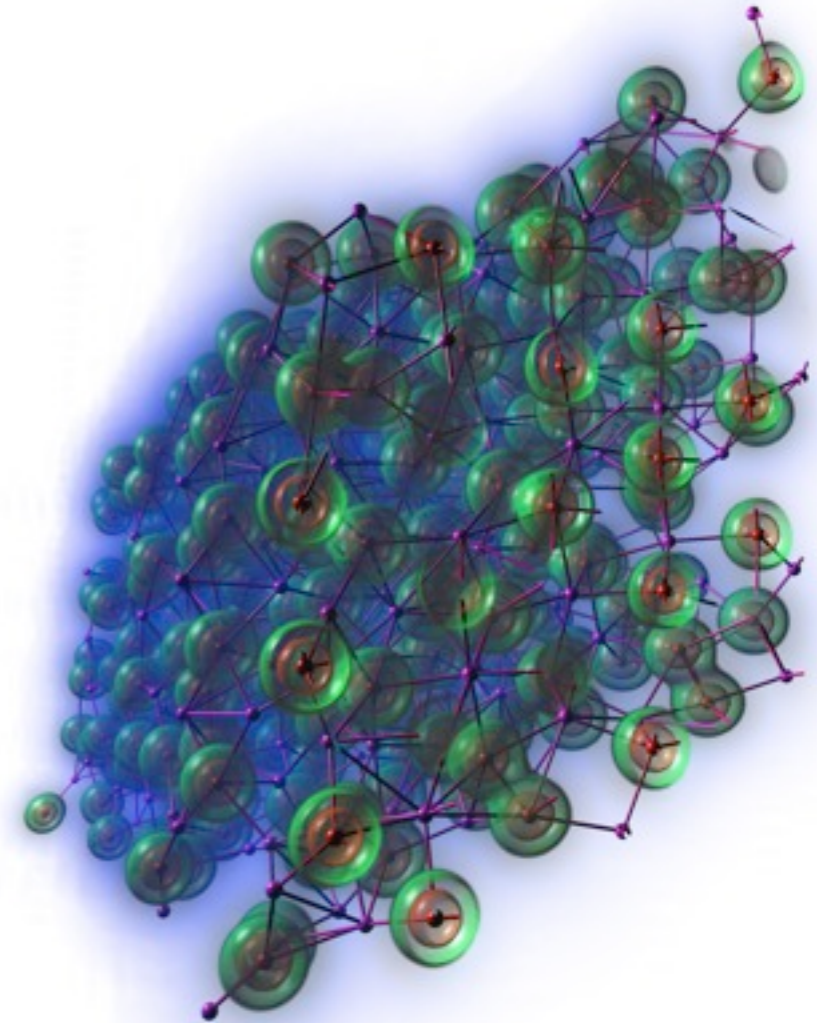
- Van der Waals surface / CPK
- Richards 1971
- Connolly surfaces
  - Solvent-Accessible Surfaces
  - Solvent-Excluded Surfaces
  - other abstractions, ribbons



Cipriano & Gleicher, TVCG 07

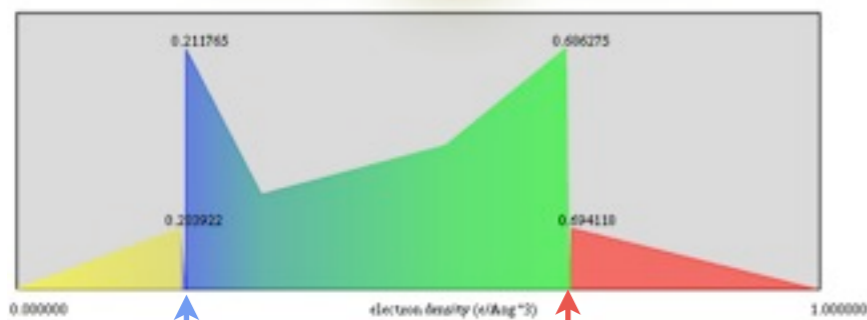
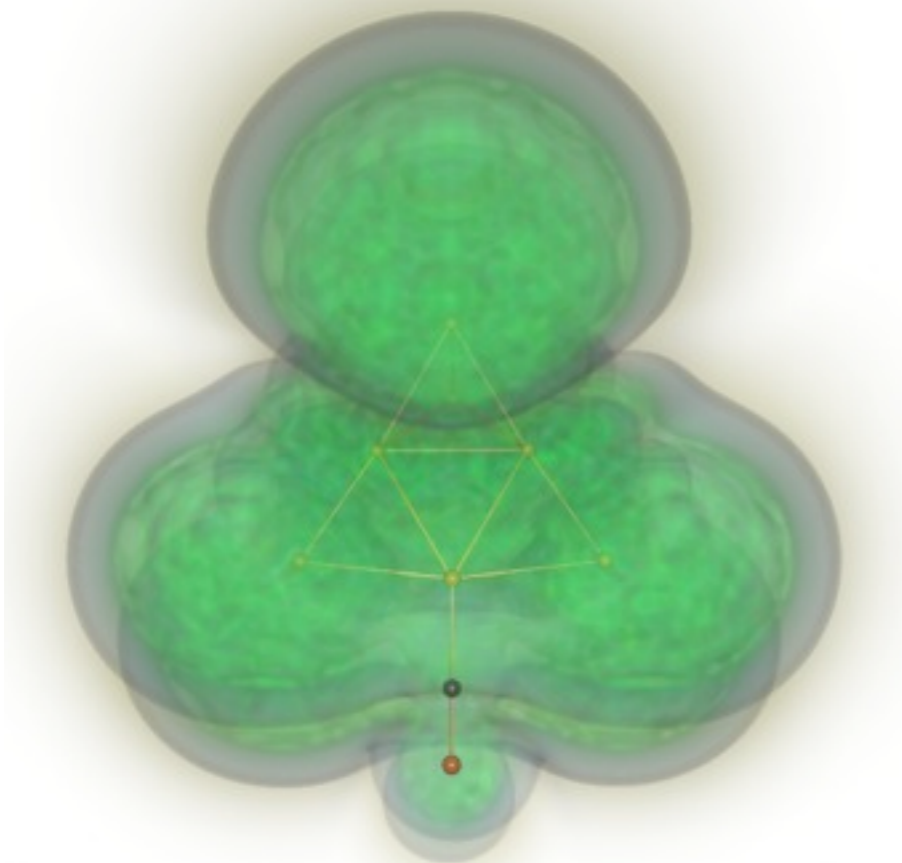
# Nanovol

- Domain-specific vis tool
  - ball & stick
  - volume rendering from SCF or other fields
  - selection/modeling/analysis
- GPU ray-casting for interactive rendering
  - Tri-cubic spline interpolation
- Volume render electron density field (SCF)
  - generate approximate density field for larger MD data
  - feed transfer functions into analysis code

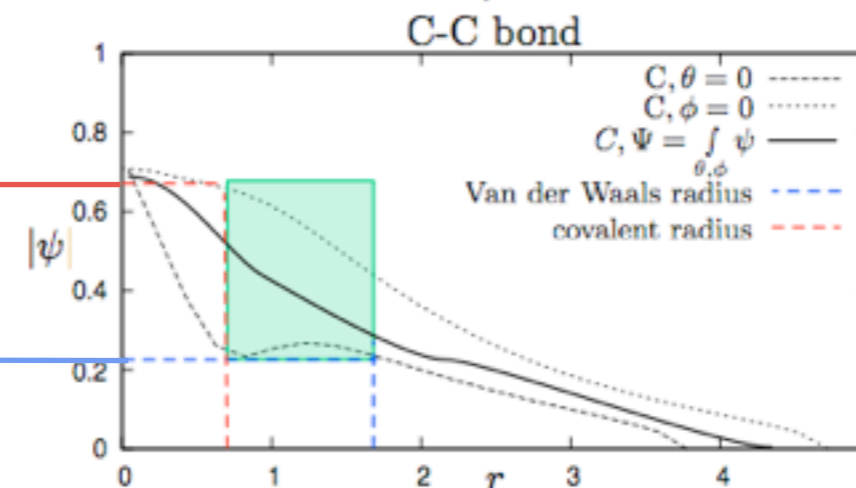
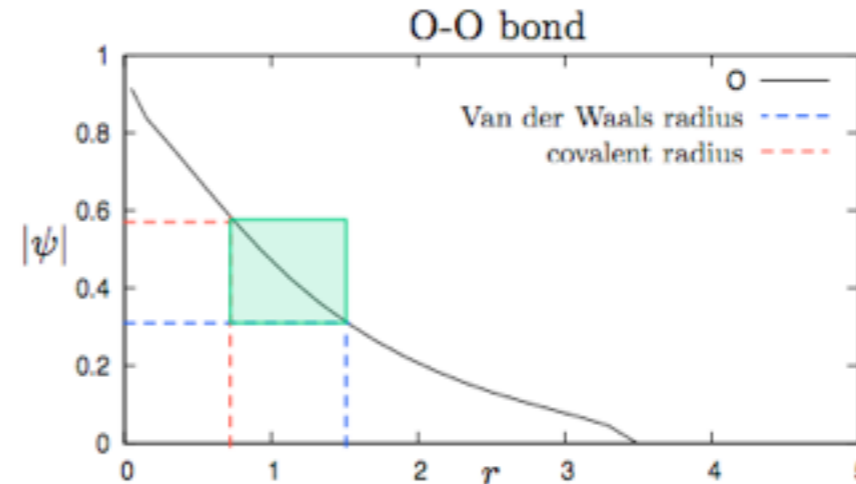


# Uncertainty classification

- Get distribution of abs(electron density) vs radius, from DFT on bulk compound
- Map Van der Waals, chemical bond radii to a **density interval**.
- use this in a transfer function.



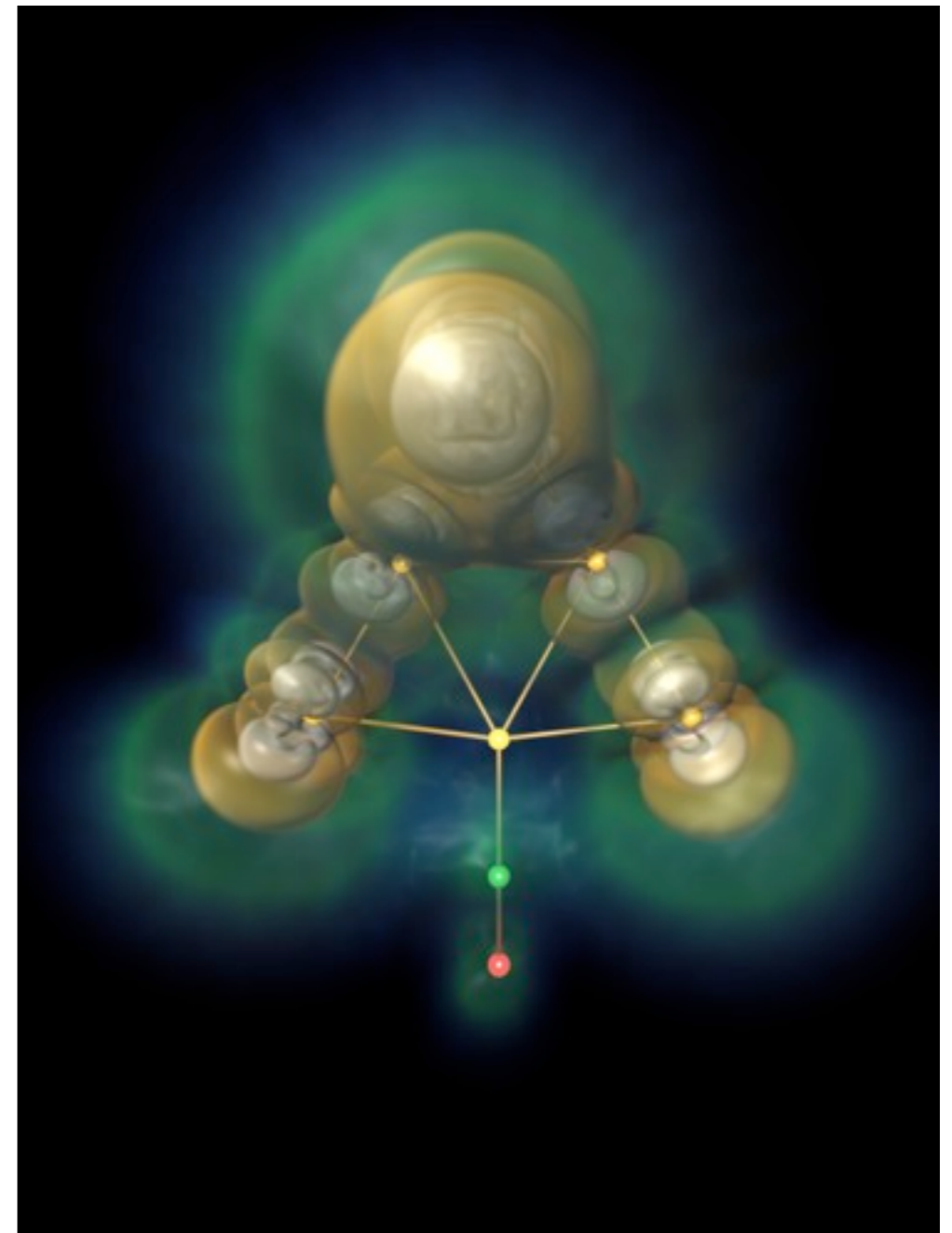
outside interface (we don't know) inside





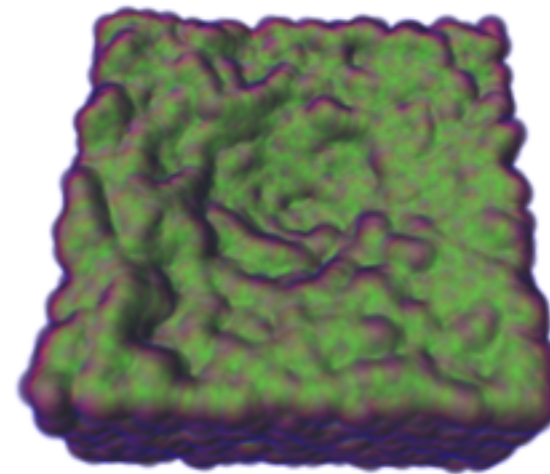
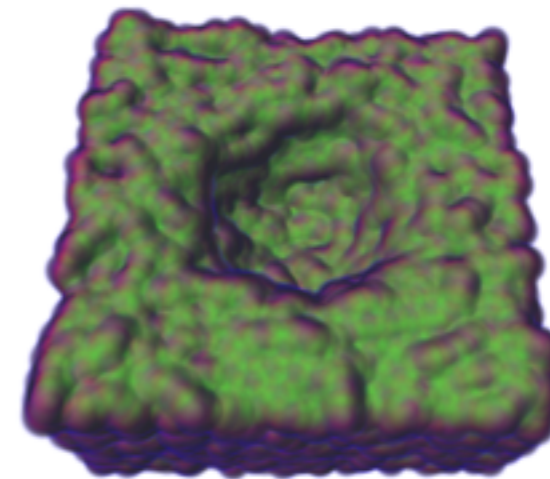
# DFT use case: CO Adsorption

- DFT computation in NWChem
- bonding energetics of CO in Pt<sub>7</sub> cluster
- White: made-up (*ad hoc*)
- Gold: metallic radius of Pt (in Pt-Pt)
- Green: covalent bond of C ( $sp^2$  dimer)
- Blue: Van der Waals radius of C



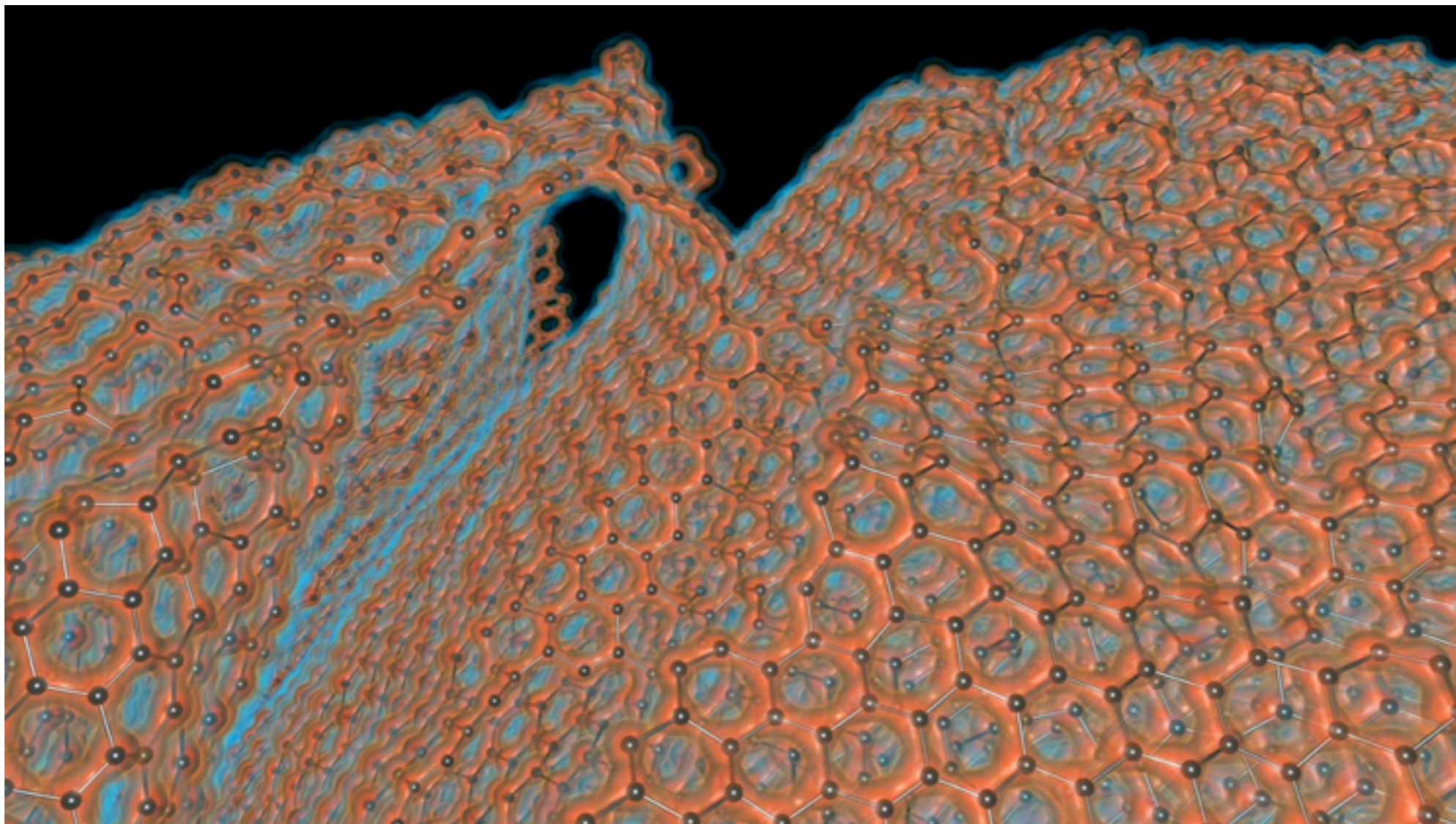
# Approximate density fields

- Create a good approximation of electron density for larger molecules
- Use distribution from DFT data to model electron density for individual atoms
- linear combination of *atomic* basis functions  $|\psi\rangle = \sqrt{\rho}$ 
$$r_i(\vec{x}) = |\vec{x} - \vec{p}_i|$$
$$\Psi(\vec{x}) = \sum_i \Theta_i(r_i(\vec{x}))$$
- Computation is fast, trivial to parallelize



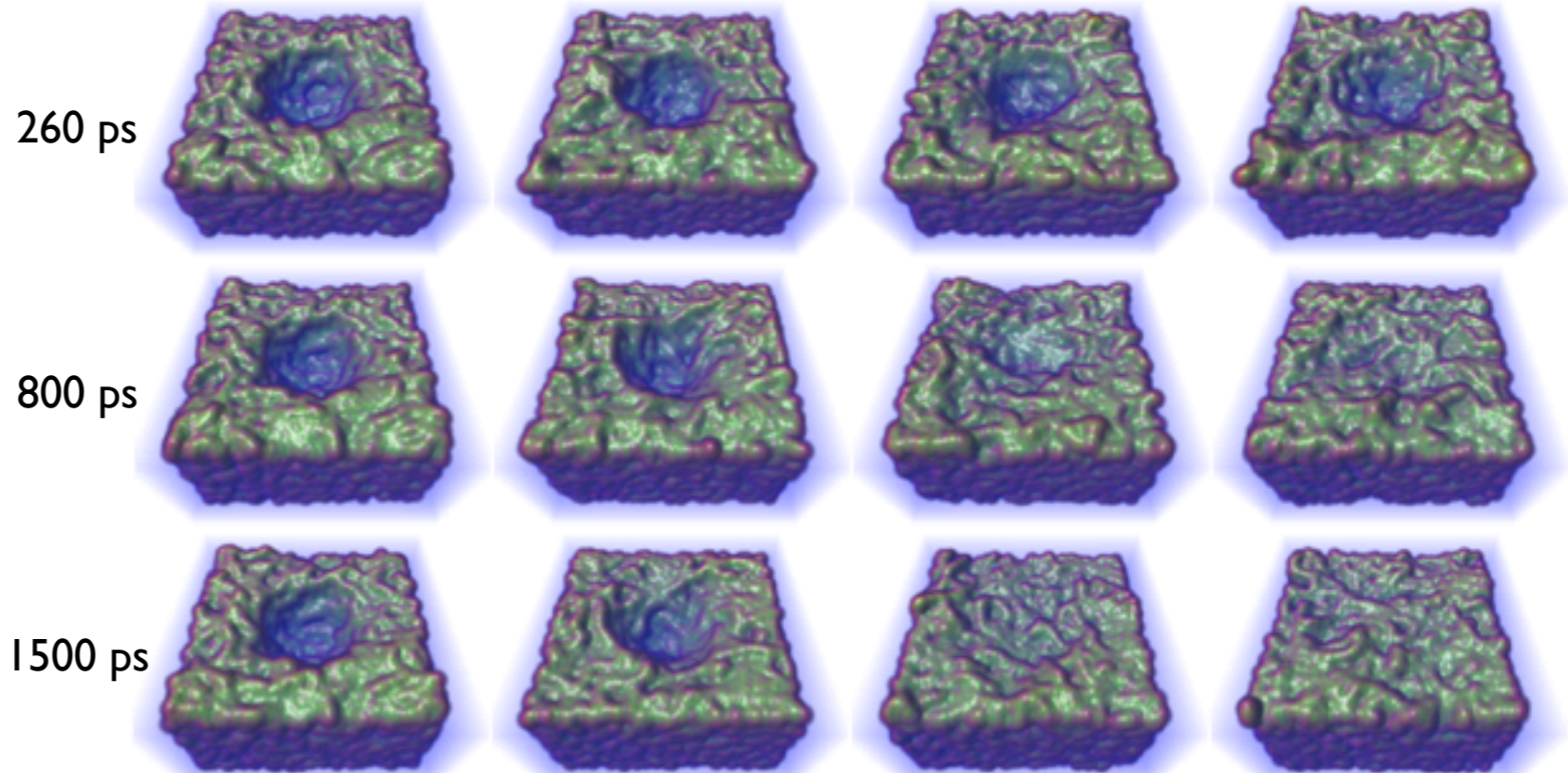
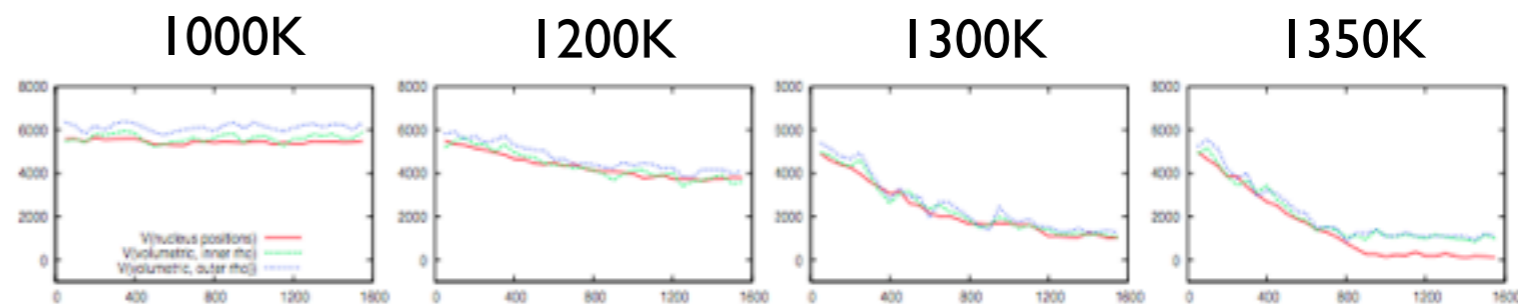
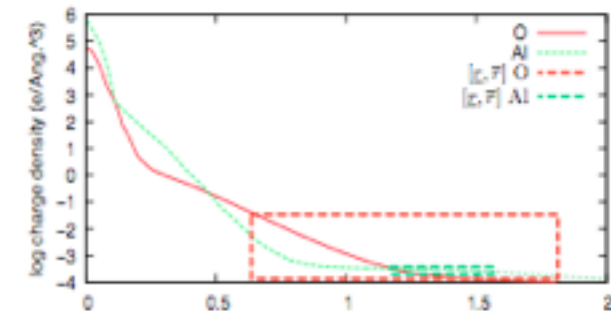
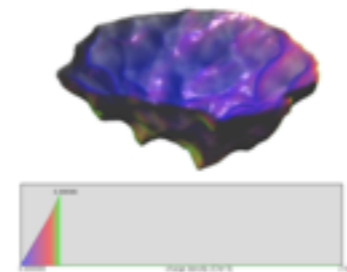
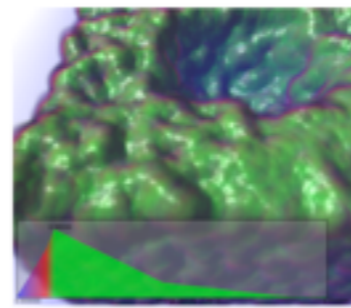
# MD use case: supersoot

- amorphous carbon, 740k atoms, MD computation of thermal annealing in LAMMPS
- Show bond structure even at a distance
- Find possible Lithium diffusion paths



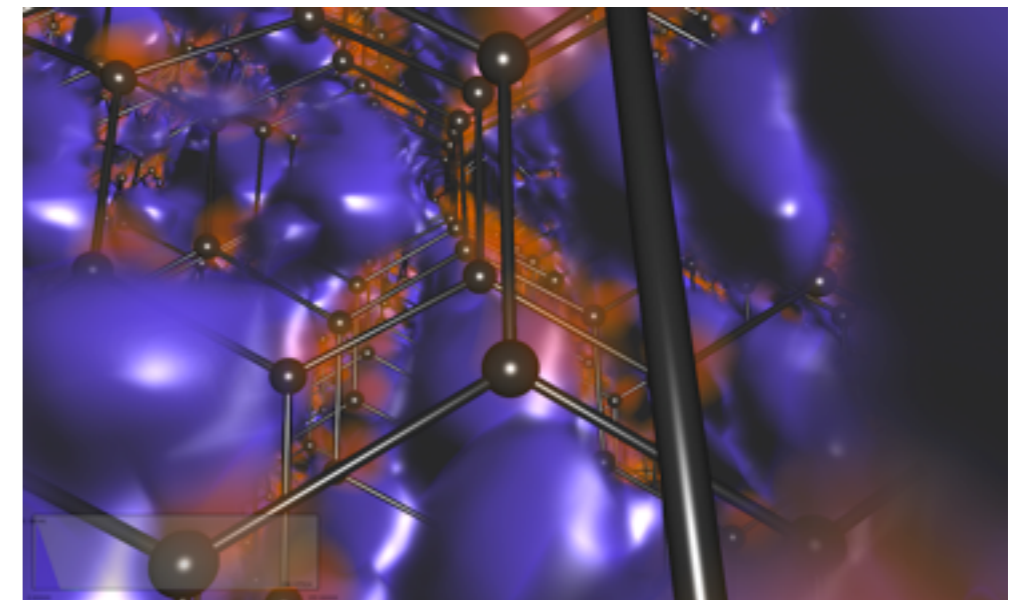
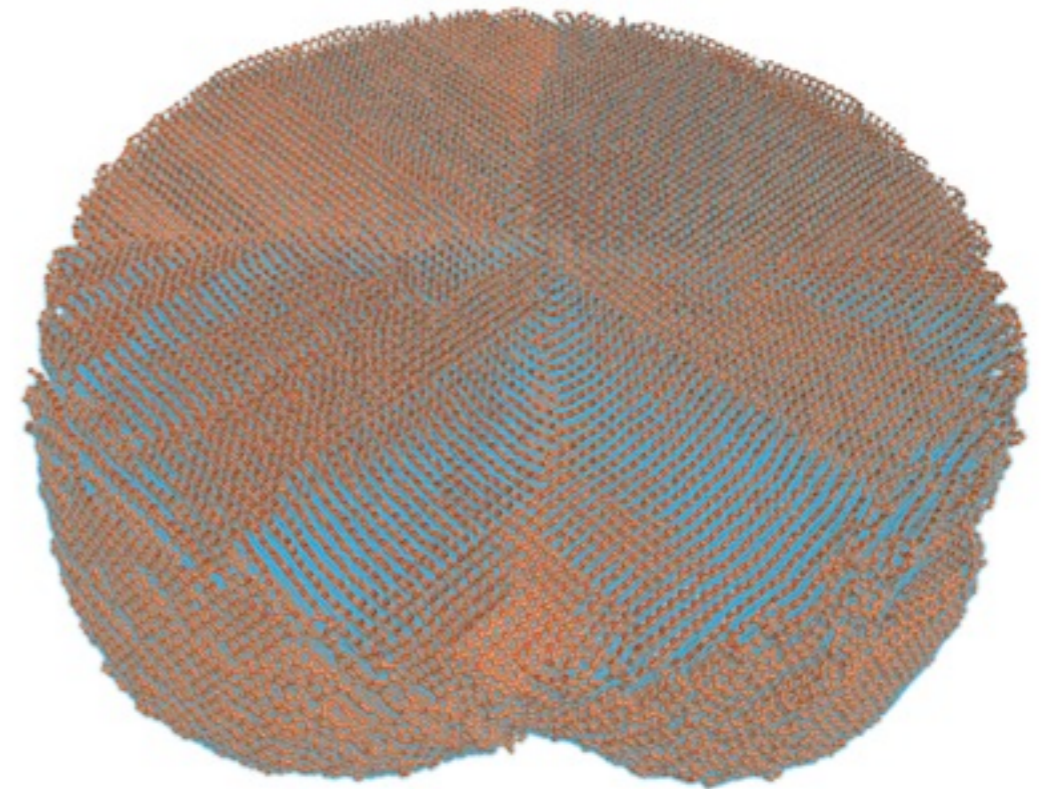
# MD use case: nanobowls

- alumina oxide nanobowls, 20k atoms x 150,000 timesteps in DL\_POLY
- Use density volume, uncertainty classification to perform geometric analysis
- bowl volume
- surface area
- curvature
- meaningful upper/lower bounds
- WYSIWYG



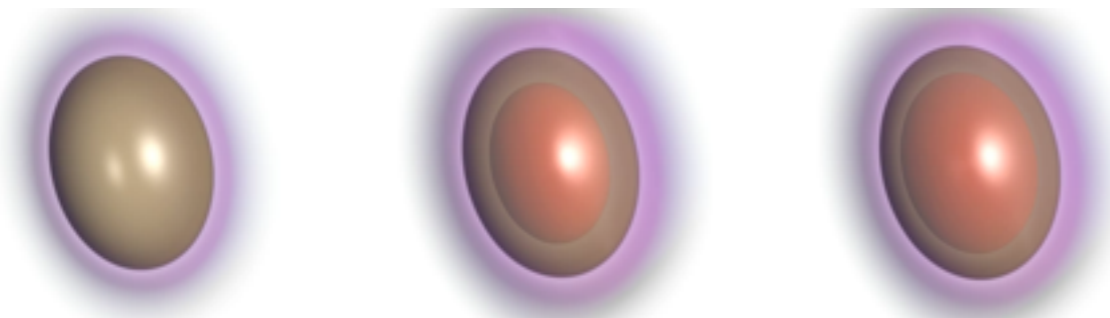
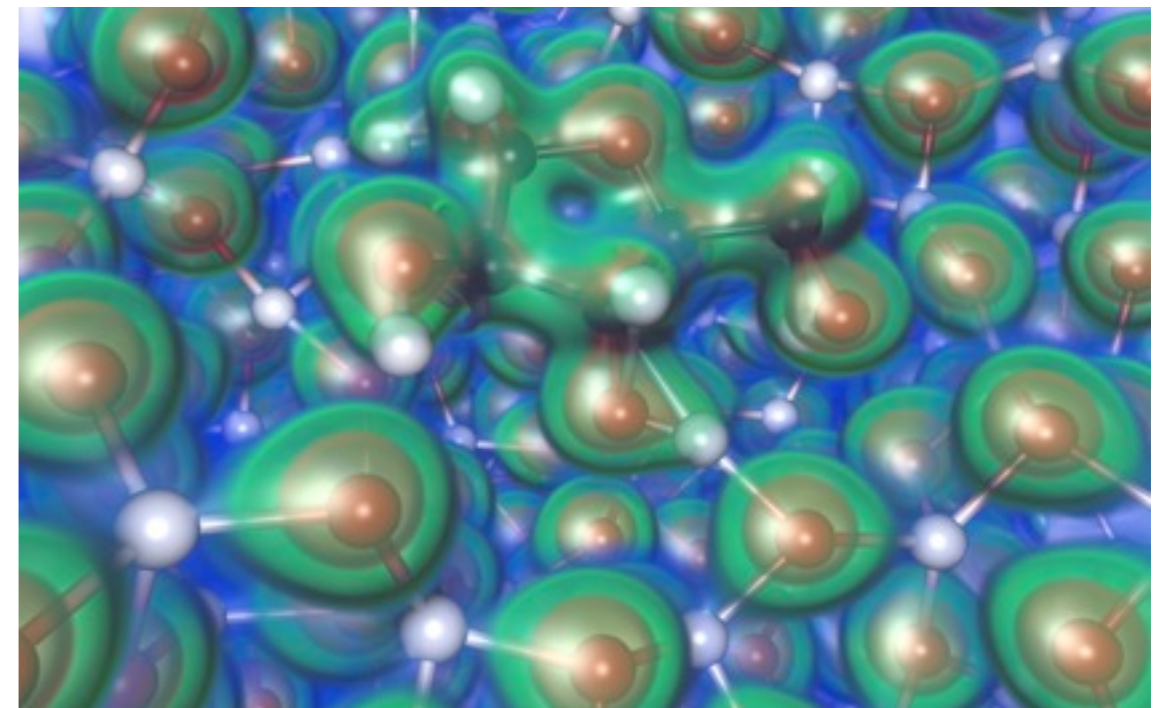
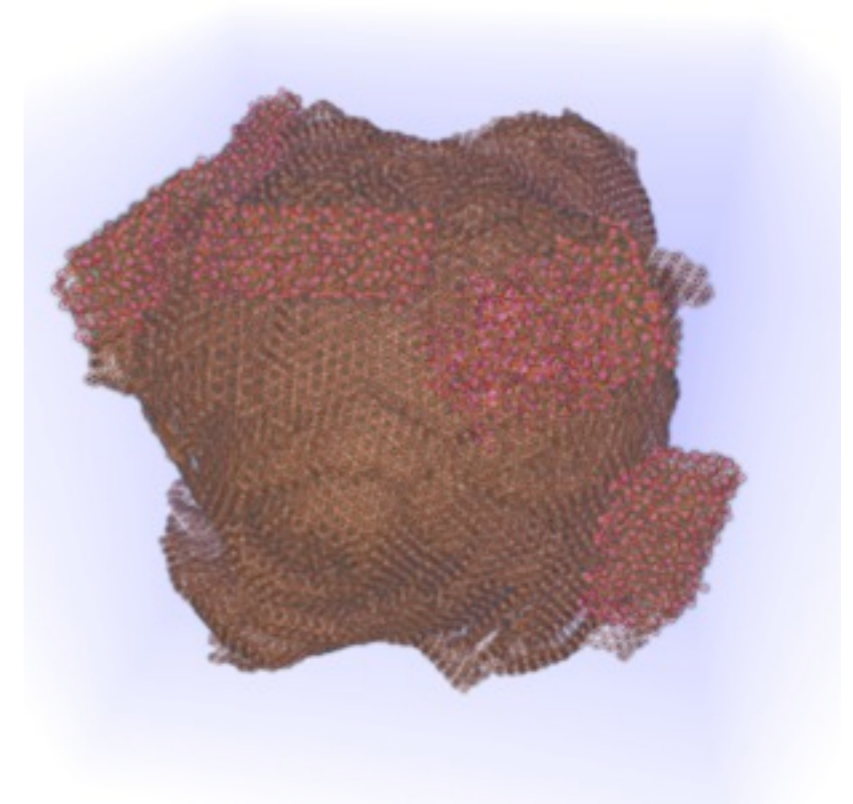
# Conclusions

- volume vis has potential in chem/materials applications
- Our contributions:
  - classify according to physically relevant electron density isovalues
    - inside, outside, and “we don’t know”!
    - molecular interfaces with uncertainty
  - use distribution to model approximate electron density



# Future work

- Expose these capabilities to more scientists
  - actually use scalar field data from DFT!
  - explore mesoscale phenomena in MD
- Classify electrostatic potential
- Classify using multiple distributions
- Similar applications (nuclear DFT)?



# Thank you

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