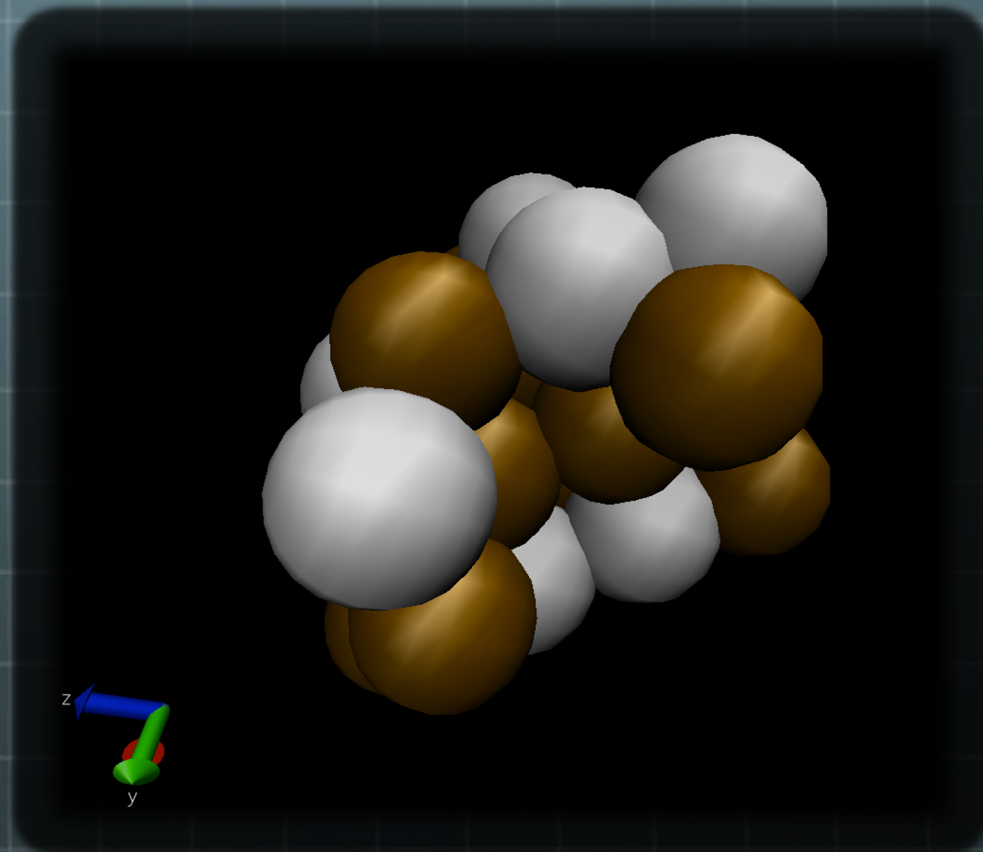


Using Simulation to Investigate the Contribution of Graphene to Pt & Pd Based Catalysts

Jason Castaneda, Oregon State University

Overview

- Background
- Objectives
- Methods
- Results & Discussion
- Conclusions
- Future Works
- Acknowledgements
- References
- Time for Questions



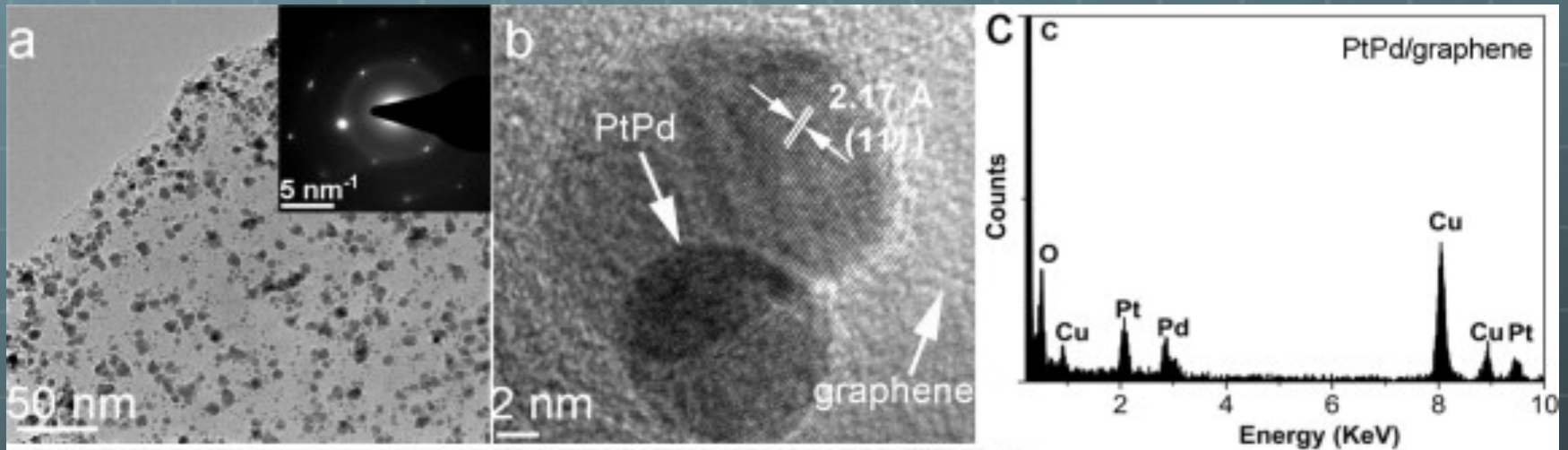
24-atom Pt-Pd Alloy Rendered in VMD

Background

- Pt based catalysts
- Current research on various catalysts in presence of graphene
- Introduction to molecular dynamics simulation
 - Classical mechanics simulations
 - Ab initio simulations

Pt-based Catalysts

- **Pt-based catalysts important to advancing new technologies**
 - **Oxidation and hydrogenation reactions**
 - **Pt/C catalysts used in methanol oxidation for direct methanol fuel cells**
- **Pt catalysts suffer from significant limitations**
 - **Pt atoms become poisoned by carbon monoxide**
 - **One-time use**
 - **Relatively short lifetime**
 - **Pt is expensive**
- **Either Pt's potency or lifetime can be improved**



TEM images of graphene decorated with PtPd from Qian et al. (2013)

Catalysts & Graphene

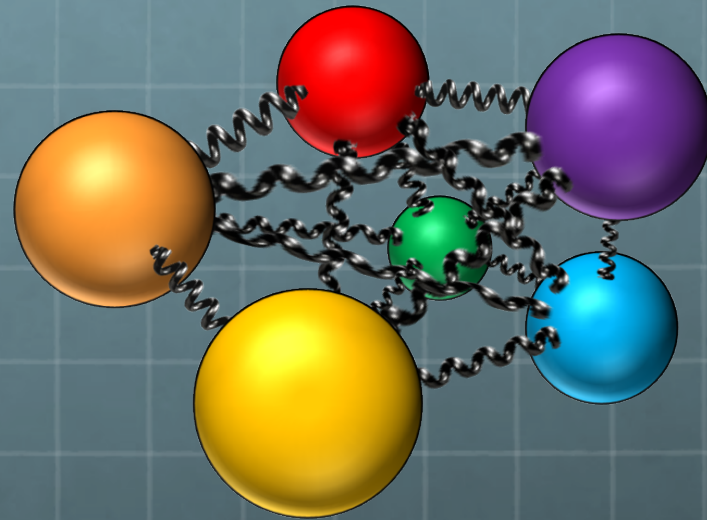
- **Current research has investigated catalysts adsorbed onto graphene**
 - **Pt-Pd on graphene had a four times larger chemically active site compared to Pt/C**
 - Au-Pd on graphene many times more effective for water purification than Au-Pd alone
- Presence of graphene significantly improves potency of catalysts
- Pt-Pd alloy raises Pt's tolerance to poisoning

Molecular Dynamics Simulation

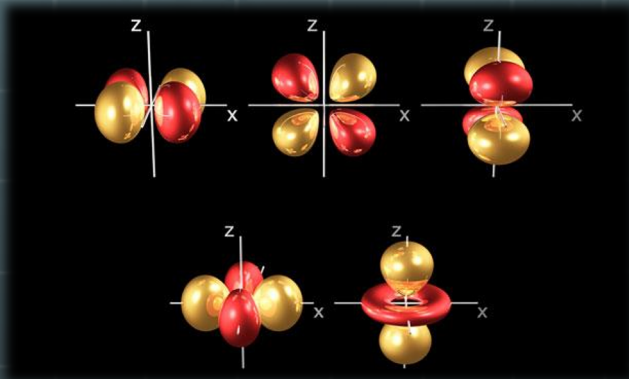
- Simulations governed by classical mechanics
 - Forces on atomic systems are computed using Newton's laws
 - Atoms modeled like marbles attached by magic springs
 - Assumptions made to make atoms behave “naturally”
- Ab initio simulation
 - Cutting edge method for molecular simulation
 - Incorporates Newtonian physics and wave functions (Schrodinger Equation)
 - Simulates the exact theoretical behavior of atoms
 - Very little assumption

$$F = ma$$

Newton's 2nd Law



Resistance (2013). Retrieved 08/06/13, from:
<http://www.javaworld.com/javaworld/jw-02-2013/130213-smart-shops-know-when-resistance-is-fertile.html>



$$E\psi(r) = \frac{-\hbar^2}{2m} \nabla^2 \psi(r) + V(r)\psi(r)$$

The Schrodinger Equation

Quantum Mechanics. (2013). Retrieved 08/06/13, from:
http://www.bbc.co.uk/science/space/universe/questions_and_ideas/quantum_mechanics

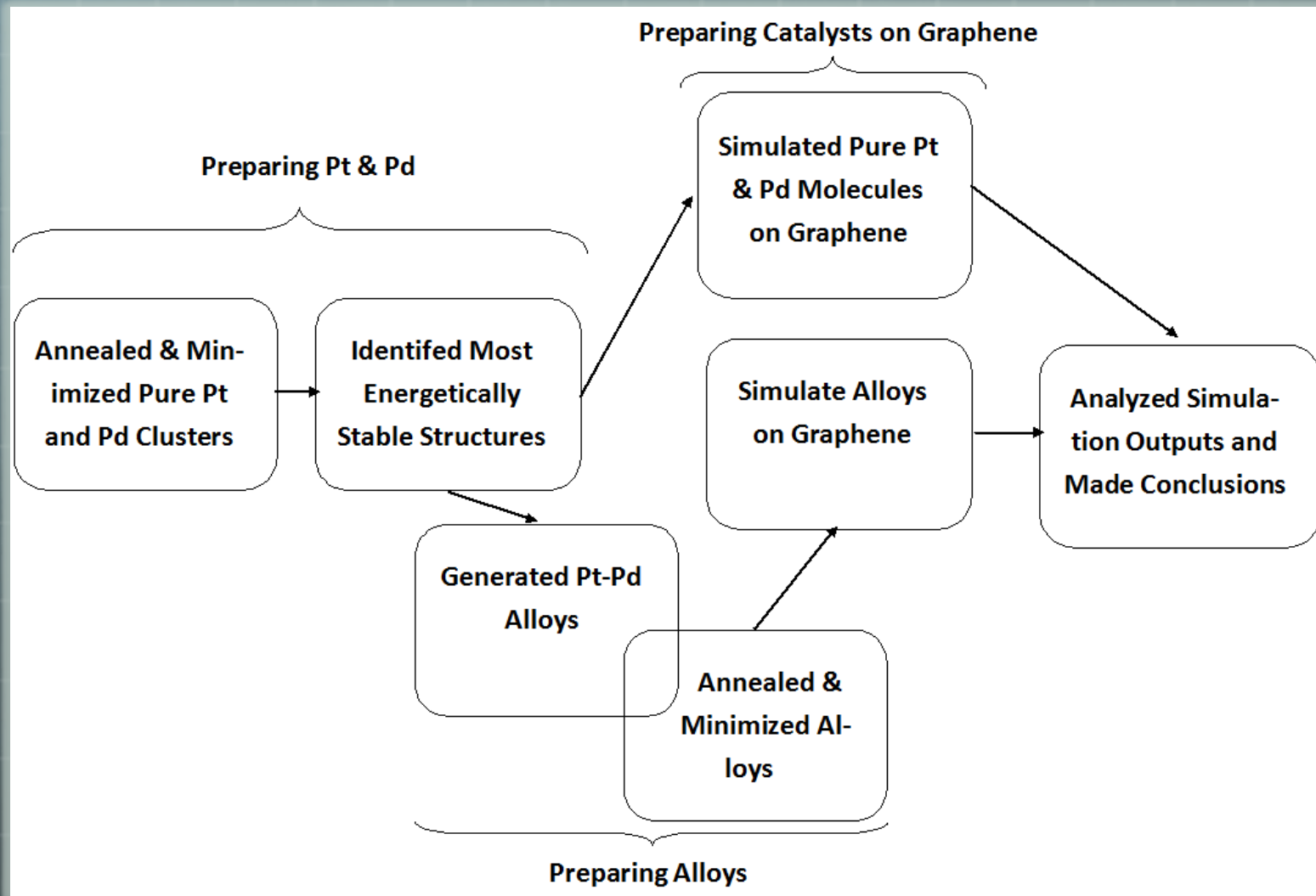
Objectives

- 🌐 What does the graphene do to the Pt that causes improved catalysis
- 🌐 Characterize the observed electronic interaction between graphene and adsorbed metals
 - 🌐 Simulate Pt, Pd, and Pt-Pd alloys deposited on graphene
 - 🌐 Charge transfer, band alignment, projected density of states

Key Research Tools

- SIESTA Computer Program (Spanish Initiative for Electronic Simulation of Thousands of Atoms)
- MATLAB
- VMD (Visual Molecular Dynamics)
- TACC (Texas Advanced Computing Center)
 - An NSF user facility operated by the Extreme Science and Engineering Discovery Environment (XSEDE)

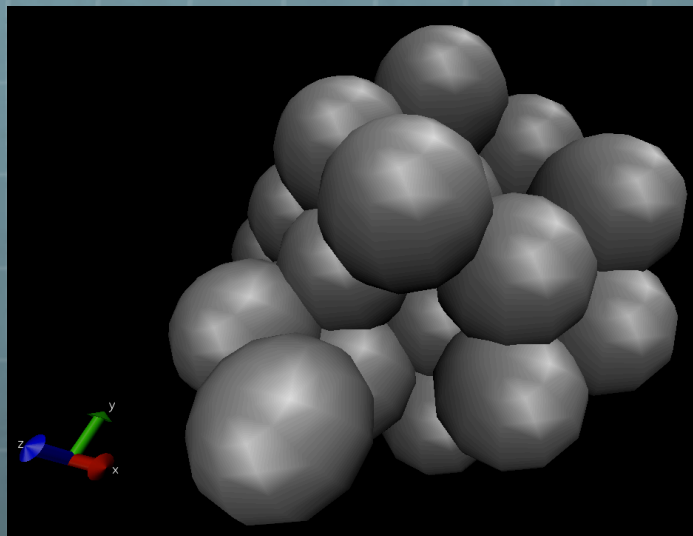
Key Research Steps



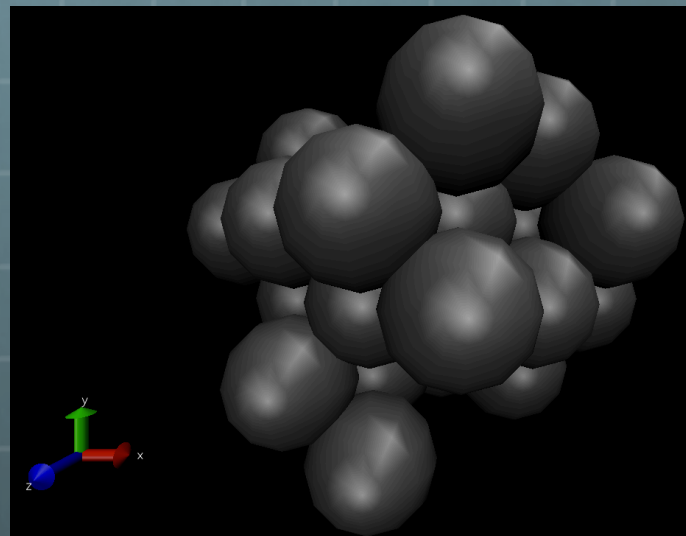
Creating Stable Molecules

- 🌐 **Simulated molecules of pure Pt & Pd from 8 to 40 atoms**
- 🌐 **Initial minimization simulation**
- 🌐 **Annealing simulation**
- 🌐 **Second minimization simulation**
- 🌐 **Plot molecule energies for each simulation**
- 🌐 **Identify especially stable molecules**

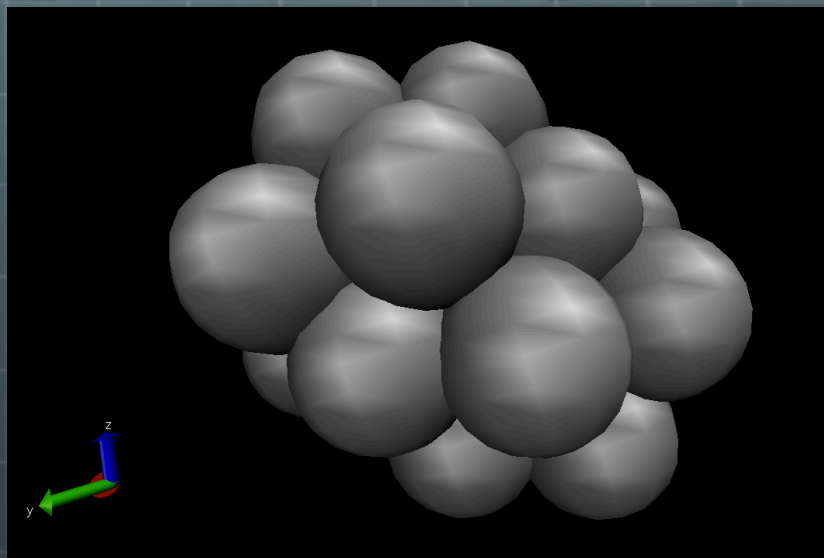
Pt molecule before annealing



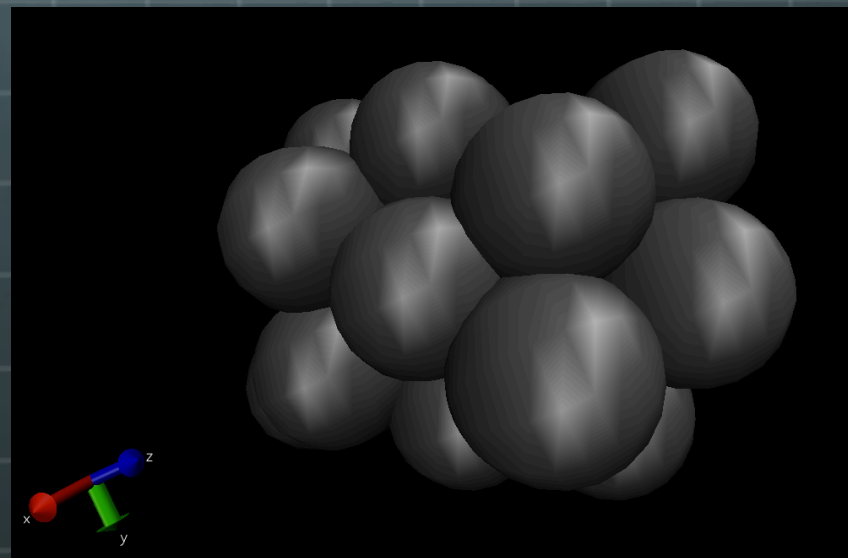
Pt molecule before annealing



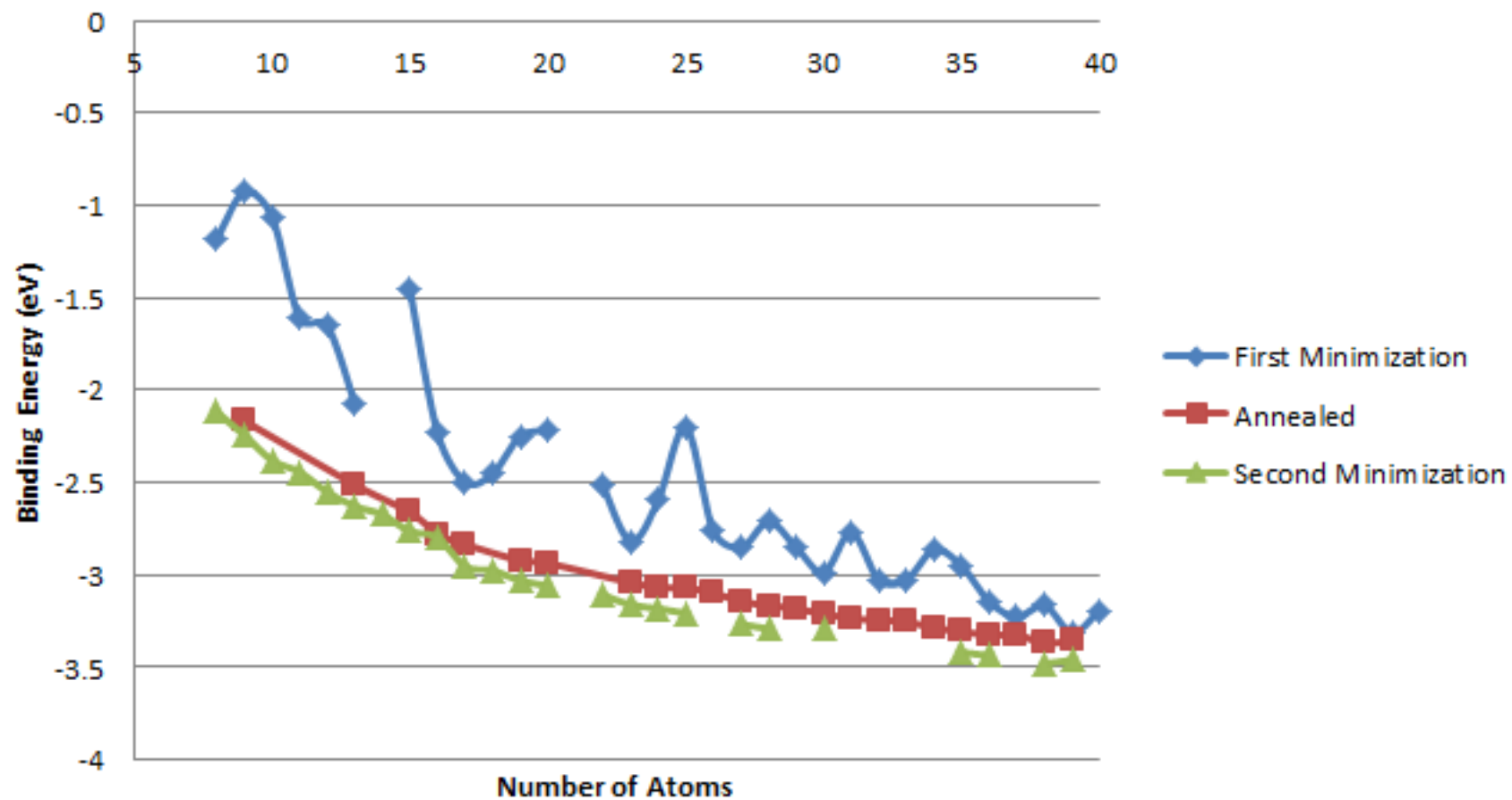
Annealed & minimized Pt molecule



Annealed & minimized Pd molecule

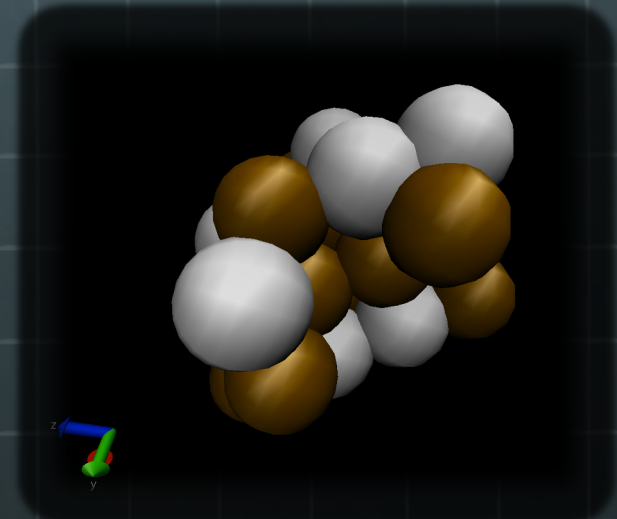
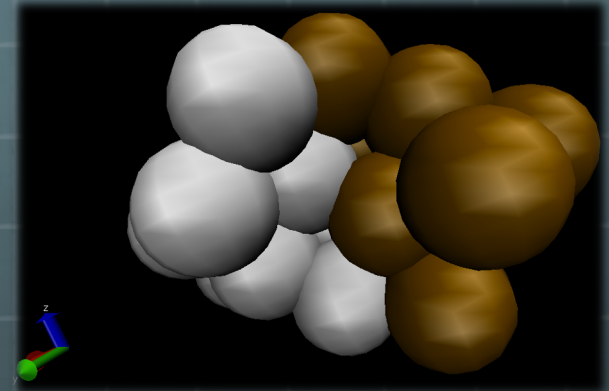


Binding Energy of Pt Molecules



Alloy Generation

- PtPd Janus Particle
- Random alloy
 - Random number generator in MATLAB
 - Roughly 50/50
- Repeat min/anneal for alloys



Catalysts on Graphene

- Created graphene structure in SIESTA
- Added catalysts
 - Pt/graphene
 - Pd/graphene
- Ran minimization simulations

Results & Discussion

- What we have learned from the annealing
 - Pt molecules seem to be amorphous shaped
 - Pd molecules seem to fit into a crystalline structure
 - The alloys and Janus particles may have either characteristic
 - They will certainly have interesting behavior which is promising

Near Results & Discussion

- Prediction of the relative potency of catalysts by examining several quantities
 - Projected density of states at the Fermi energy
 - Charge transfer
 - Binding affinity for O (introduce oxygen to the system and observe how the catalysts bind)
- We are currently in the midst of these processes

Preliminary Conclusions

- 🌐 The alloy structures will have interesting characteristics
- 🌐 Anneal/Minimization effectively stabilized the Pt and Pd molecules
- 🌐 What will this mean for catalysis?
- 🌐 I have become much more proficient in various simulation techniques and code writing

Future Work

- 🌐 **Finish graphene simulations**
- 🌐 **Perform the same graphene simulations with alloys**
- 🌐 **Explore the difference between Pt alone and PtPd**
- 🌐 **Investigate how graphene affects Au and Au-Pd alloys**

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Questions