



Heteroepitaxial Growth Using Off-Lattice KMC

Anne Marie Tan
Brian McGuigan
Jacob Gruber

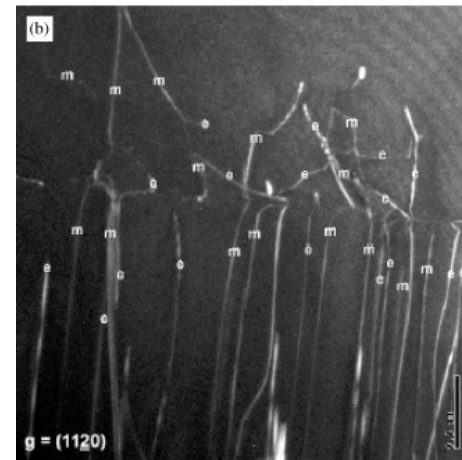
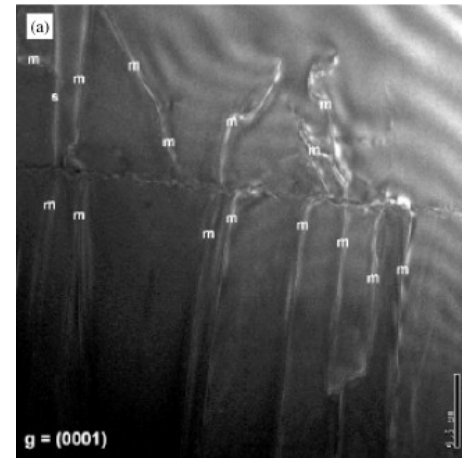
Why Heteroepitaxy?

- ❖ Difficult to Model
 - Multiple Species
 - Dislocations and point defects important
 - Species Flux important
- ❖ The Silicon Age is Ending
 - New materials and growth required
- ❖ Useful in design of Devices
 - \$\$\$



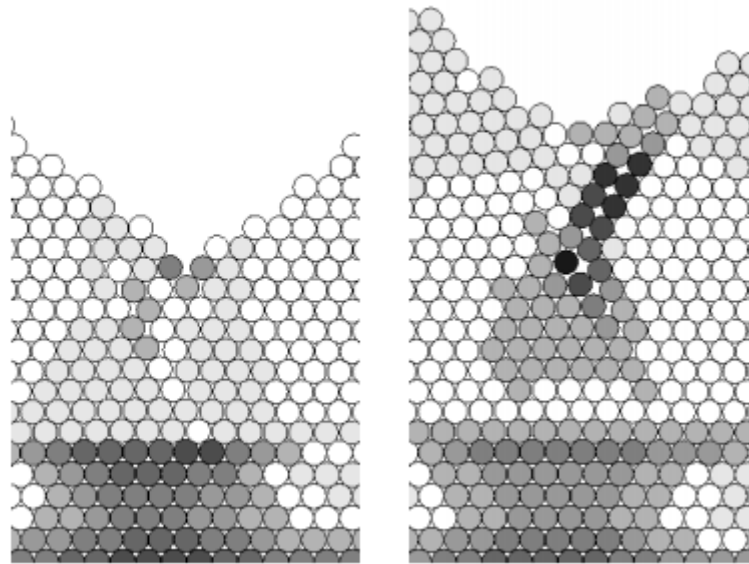
Motivation for Off-Lattice KMC Heteroepitaxy

- ❖ Lattice fixed atoms have restricted motion
- ❖ Inability to classify defects such as dislocations
- ❖ Defects play a tremendous role in semiconductor device performance
- ❖ “Strain” between multispecies interfaces cannot be accurately classified with on-lattice KMC



<http://www.sciencedirect.com/science/article/pii/S0022024804003112>

Previous Work



$$\epsilon = -.5\%$$

❖ Biehl (2004)

- Heteroepitaxy
 - Particles differ in size
 - Leonard-Jones Potential
- KMC
 - Time scale too long for MD
- Off Lattice
 - Strain Relaxation
 - Dislocation formation
 - Diffusion

Off-Lattice KMC algorithm

Initialization:

- Initialize substrate
- “Bin” atoms
- Initialize rate catalog
 - Find ‘free’ atoms
 - Find Potential Energy Surface (PES)
 - Calculate rates to local minima in PES

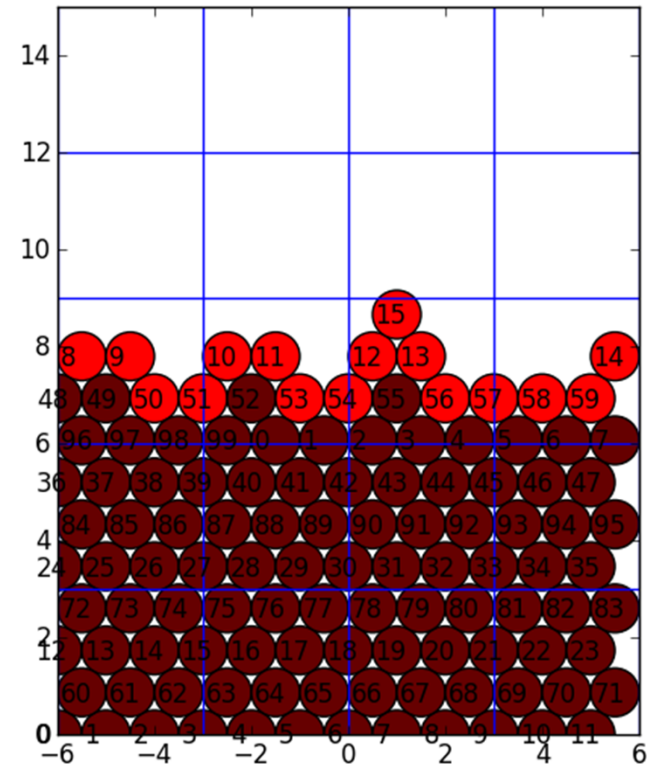
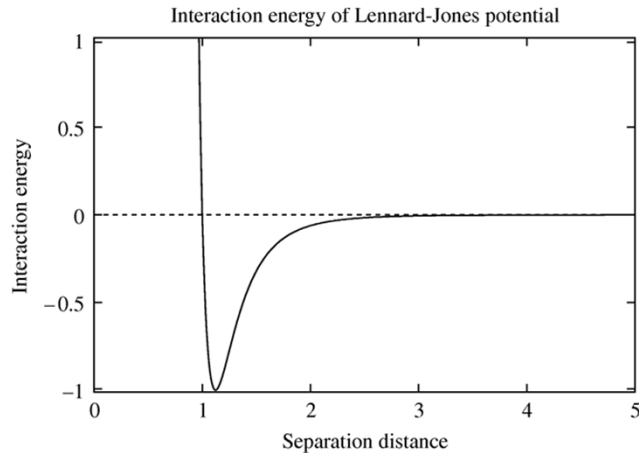
Main loop:

- Choose a move from the rate catalog
- Deposit an atom/make a diffusion move
- Perform local relaxation
- Update “binning” (local update)
- Update rate catalog (local update)
- ...repeat over and over again...



Atom “Binning”

- ❖ L-J interaction falls off rapidly and becomes negligible at distances $> 3\sigma$
- ❖ Consider only particles in a neighborhood region when calculating forces, energies, and for determining which rates need to be recalculated after a move has been made
- ❖ Fast identification of surface atoms



http://www.emeraldinsight.com/content_images/fig/3980020402014.png

KMC: N-Fold Rate Catalog

- ❖ KMC rate catalog made from surface atom PES scan and deposition rate

$$R_{Deposition} = \left(\frac{L_{substrate}}{a_s} \right) * \frac{Monolayer}{s}$$

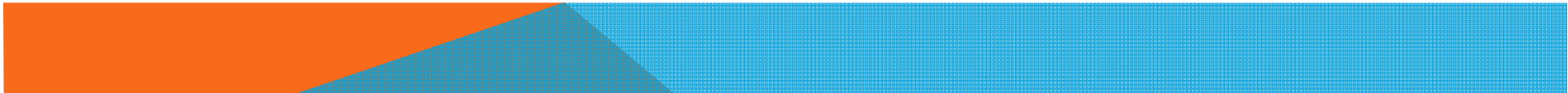
$$R_{Diffusion} = v_0 * \exp\left(-\frac{\Delta E}{kt}\right)$$

where $v_0 = 10^{12}/s$

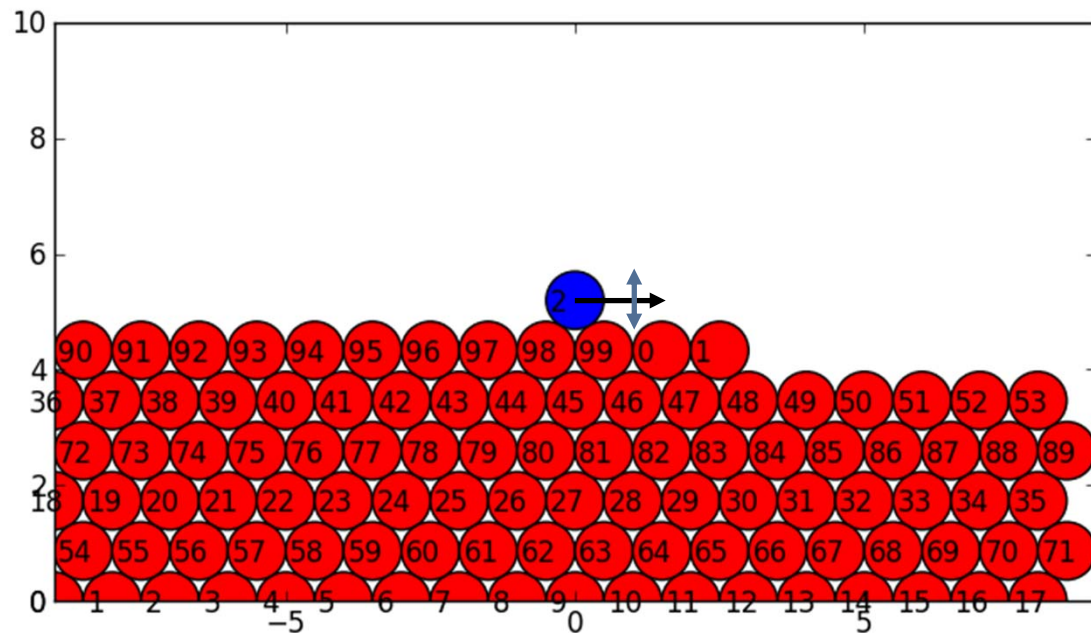
- ❖ Catalog is scaled according to total rate
- ❖ Random number 0-1 is chosen
- ❖ Bisection search algorithm chooses event

Event	Barrier Height ΔE	Final Position
Atom 1: Move Left	$\Delta E1$	X1
Atom 1: Move Right	$\Delta E2$	X2
Atom 2: Move: Left	$\Delta E3$	X3
Atom 2: Move: Right	$\Delta E4$	X4
.	.	
.	.	
.	.	
Deposition	----	Xn

0
.....
1



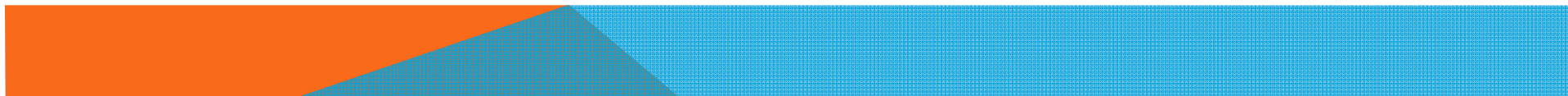
Generation of PES – Making a virtual move



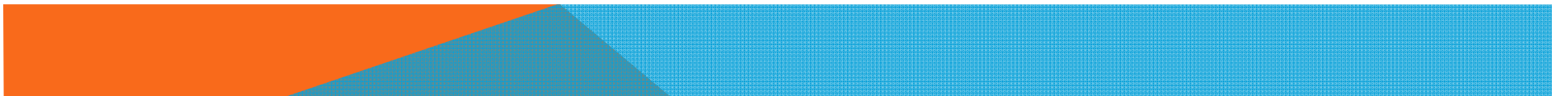
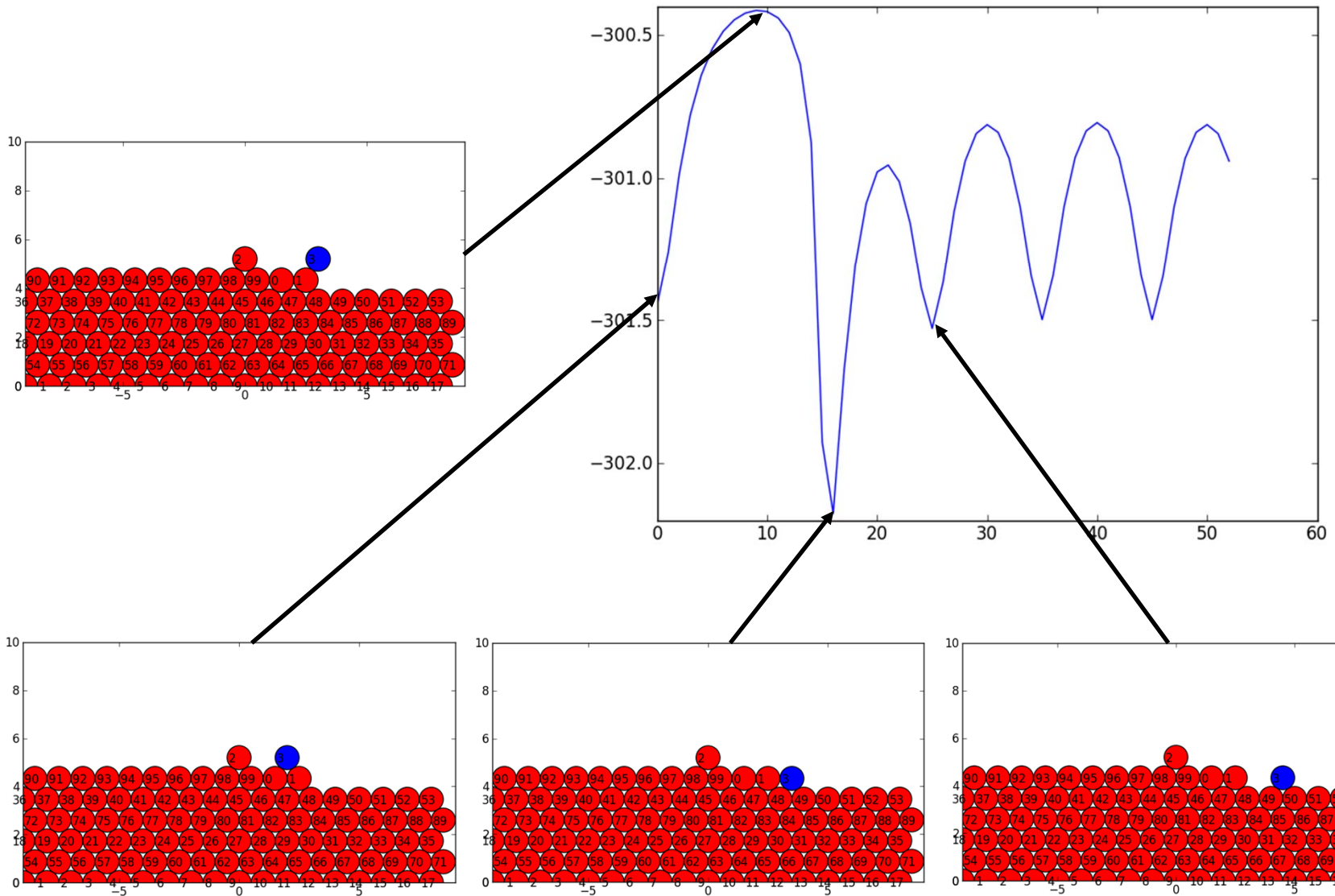
Move atom slightly along the x-direction



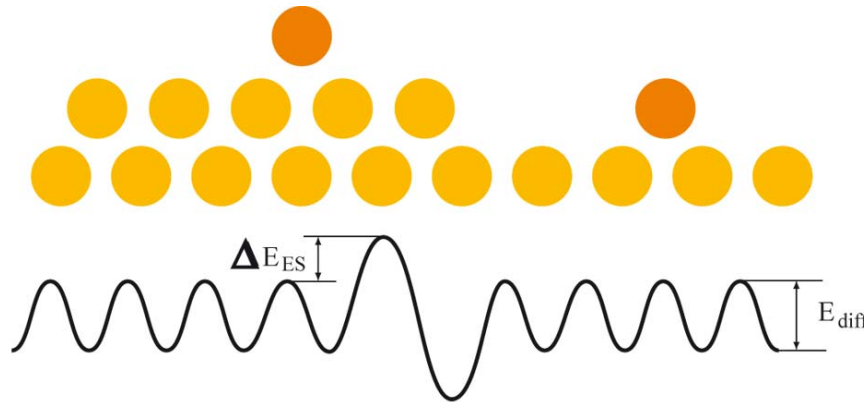
Minimize energy with respect to the atom's y-position
(using "frozen crystal approximation")



Generation of PES



Physics behind it...Ehrlich–Schwoebel barrier

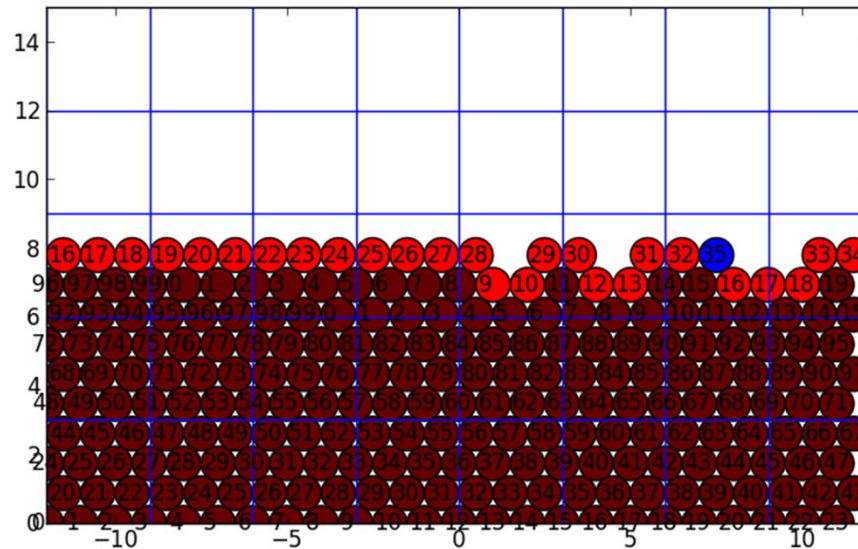


<http://eng.thesaurus.rusnano.com/upload/iblock/ebd/ehrlieh-schwoebel-barrier.jpg>

- ❖ Atom approaching the step on the lower side has a lowered energy barrier to attach to the step → site at the step has a larger number of nearest neighbors
- ❖ Atom approaching the step on the top side faces an additional energy barrier ΔE_{ES} , known as Ehrlich–Schwoebel barrier → has to pass through a state with a low number of nearest neighbors in order to cross the step edge

Deposition Event

- ❖ Surface atoms are identified from surface bins
- ❖ Atom is placed on top of and either to the left or right of a randomly chosen surface atom
- ❖ Atoms are relaxed to local minimum with molecular statics



Molecular statics relaxation

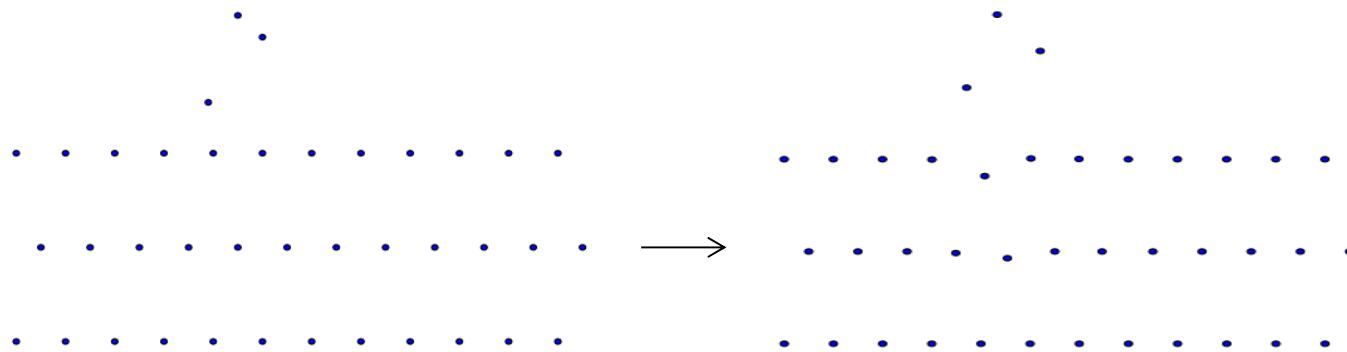
Conjugate Gradient Minimization Algorithm

- $\Delta x_0 = -\nabla_x f(x_0)$
- Perform Initial Line Search: Determine α_0 for x and y direction of each atom such that $f(x_0 + \alpha\Delta x_0)$ is minimized
- Update Positions: $x_1 = x_0 + \alpha_0\Delta x_0$
- Initialize Conjugate Direction: $s_0 = \Delta x_0$
 1. Determine the Steepest Direction: $\Delta x_n = -\nabla_x f(x_n)$
 2. Determine Conjugate Direction Step Size β_n According to Polak-Ribiere Formalism: $\beta_n = \frac{\Delta x_n^T (\Delta x_n - \Delta x_{n-1})}{\Delta x_{n-1}^T \Delta x_{n-1}}$
 3. Update the Conjugate Direction: $s_n = \Delta x_n + \beta_n s_{n-1}$
 4. Perform Line Search: Determine α_n for x and y direction of each atom such that $f(x_n + \alpha\Delta s_n)$ is minimized
 5. Update Positions: $x_{n+1} = x_n + \alpha_n s_n$
 6. Repeat 1-5 Until Forces on All Atoms are Sufficiently Small

Molecular statics relaxation of simple system

Initial Configuration

Relaxed Configuration



Fixed Positions on Bottom Row



Adaptive KMC

❖ Oscillation between states

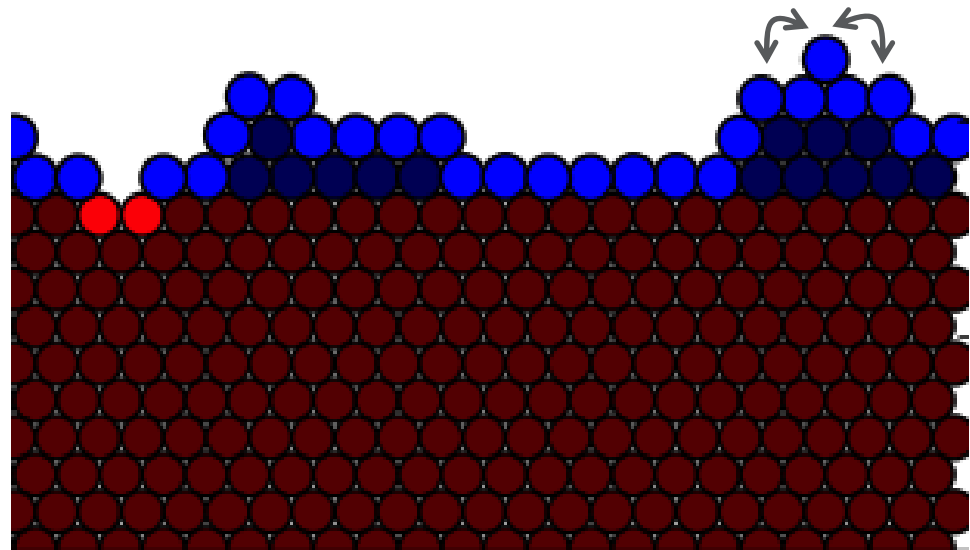
- See it in Action!
- Rate $\propto \exp(-\Delta E)$
- ΔE is small, rate blows up
- Moves between these states dominate all others
- No evolution in system

❖ Solution

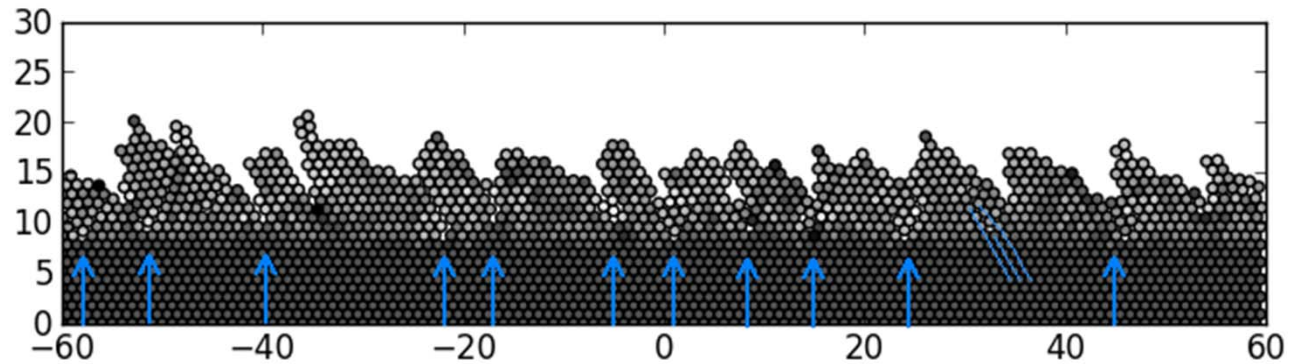
- Scale Rate by $\exp(-\kappa N)$
- κ = Damping Constant
- N = number of times move has occurred before

❖ Ideal Solution

- Combine states into superstates
- High programming cost

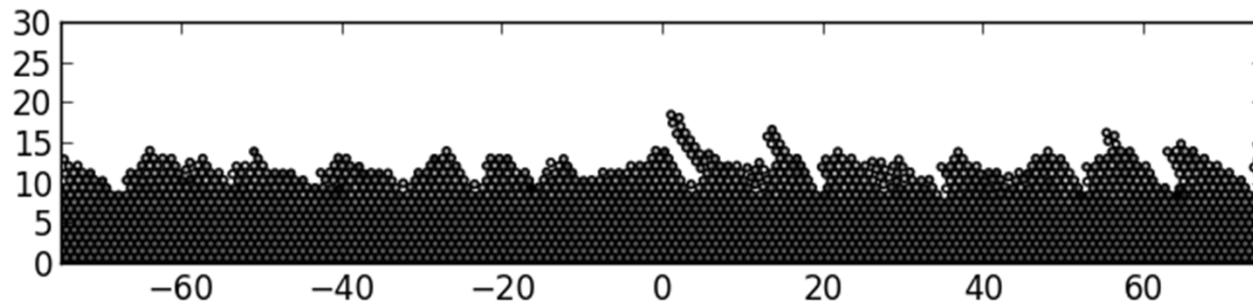


Results: Two Species System Video



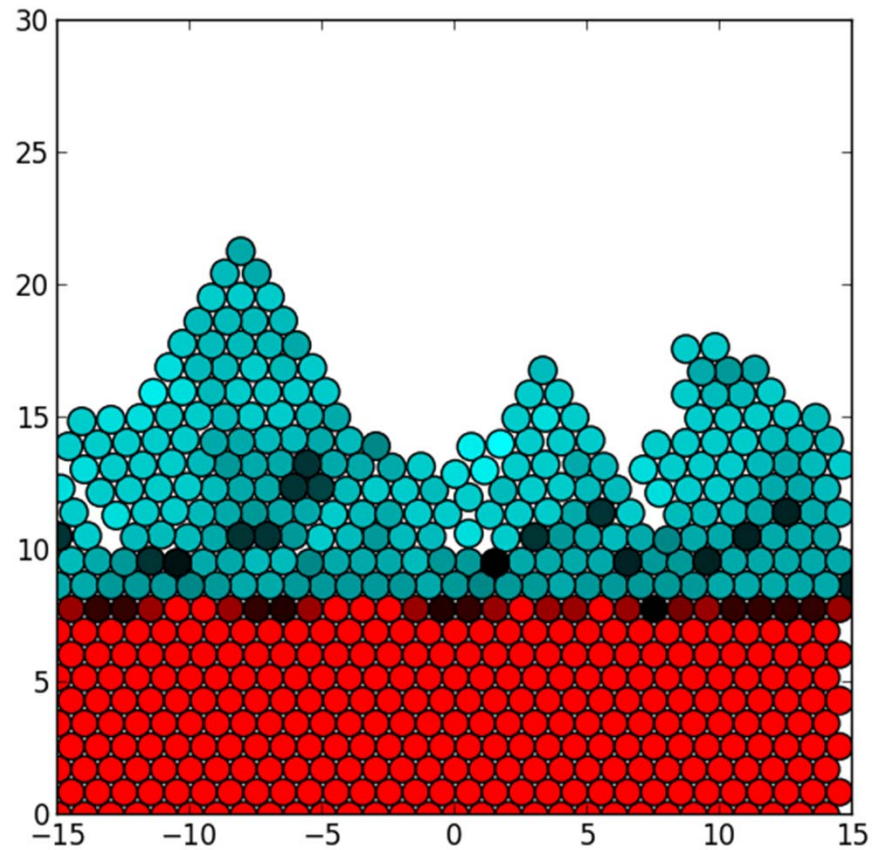
- ❖ Substrate Lattice Constant: 1.0
- ❖ Film Lattice Constant: 1.05
- ❖ <http://www.youtube.com/watch?v=i3dCXWubuFw>

Results: Two Species System Video



- ❖ Substrate Lattice Constant: 1.0
- ❖ Film Lattice Constant: 0.95
- ❖ <http://www.youtube.com/watch?v=Fec6yvWzam8>

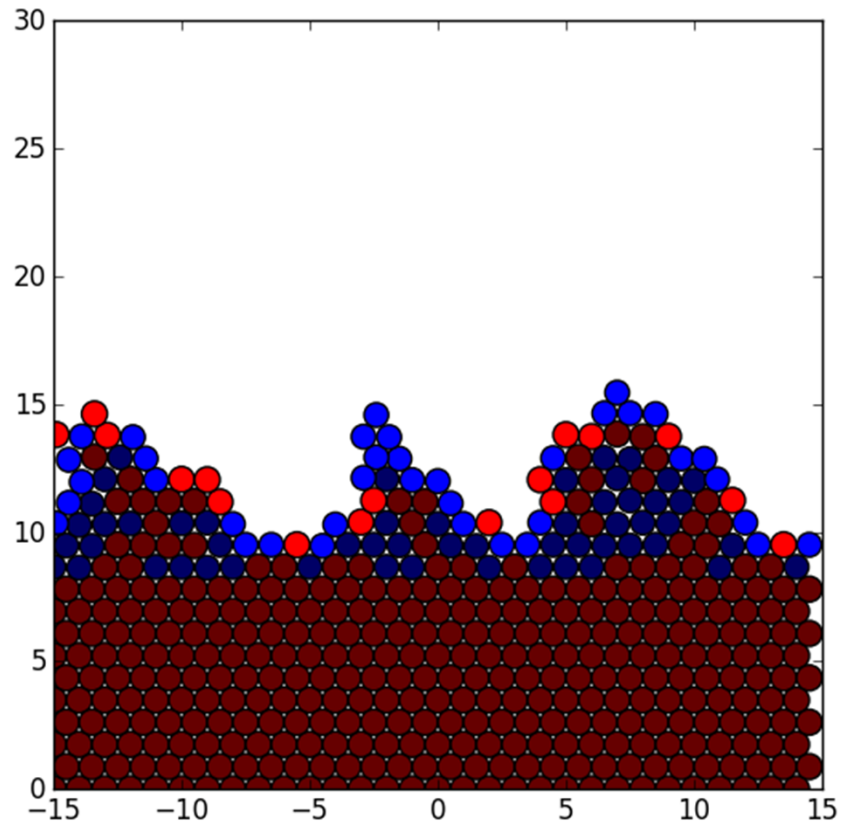
Classifying Strain/Defects:



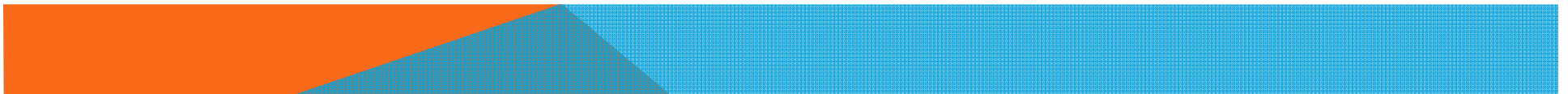
- ❖ Color map based on average neighbor interatomic distance



Extending this model: Multi-Species Deposition



❖ Random probability of depositing both species



Future Work/Questions

- ❖ Model shows reasonable results: Dislocations can be classified
- ❖ Increase system size for 2D
- ❖ Extend to more complicated potentials
- ❖ Extend to three dimensions
- ❖ Questions???

