

Simulation of Metal Electrodeposition Using the Kinetic Monte Carlo and Embedded-Atom Methods

by

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Abstract

The effects of the microstructure of metal films on electric component performance and longevity have become increasingly important with the recent advances in nanotechnology. Depending on the application of the metal films and interconnects, certain microscopic structures and properties are preferred over others. A common method to produce these films and interconnects is through electrodeposition. As with every process, the ability to control the end product requires a detailed understanding of the system and the effect of operating conditions on the resulting product. To address this problem, a three-dimensional on-lattice kinetic Monte Carlo (KMC) method is developed to conduct atomistic simulations of single crystal and polycrystalline metal electrodeposition. The method utilizes the semi-empirical multi-body embedded-atom method (EAM) potential that accounts for the cohesive forces in a metallic system. The resulting computational method, KMC-EAM, enables highly descriptive simulations of electrodeposition processes to be performed over experimentally relevant scales.

In this work, kinetically controlled copper electrodeposition onto single crystal copper under galvanostatic direct-current conditions and polycrystalline copper under potentiostatic direct-current conditions is modelled using the aforementioned KMC method. Four types of surface processes are considered during electrodeposition: deposition, dissolution, surface diffusion and grain boundary diffusion. The equilibrium microstructures from single crystal experiments were validated using molecular dynamics (MD) simulations through the comparison of energy per atom and average coordination number. The growth mode observed is in agreement with experimental results for the same orientation of copper. MD simulation relaxes constraints and approximations resulting from the use of KMC. Results indicate that collective diffusion mechanisms are essential in order to accurately model the evolution of coating morphology during electrodeposition.

In the polycrystalline simulations, the effect of surface energy is taken into account in the propensities of deposition and dissolution. Sub-surface grain volume measurements were obtained from simulation results and the grain volume evolution with time is in agreement with both qualitative observations based on the deposit morphology and surface

energy calculations. Simulations of polycrystalline deposition agree with findings from experimental studies that the evolution of the root-mean-squared roughness of the deposit during the early stages of deposition follows a power law relationship with respect to time $\approx t^n$. Furthermore, the power law exponent on time is determined to be $n \approx 0.5$, also in agreement with the experimental values reported in the literature.

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Table of Contents

List of Tables	ix
List of Figures	x
Nomenclature	xii
1 Introduction	1
1.1 Research Motivation	1
1.2 Objectives	3
1.3 Structure of Thesis	4
2 Background	5
2.1 Electrodeposition	5
2.2 Embedded-Atom Method Potential	10
2.3 On-Lattice Kinetic Monte Carlo Method	11
2.3.1 Ising and Potts Models	13
2.3.2 Solid-on-Solid and Solid-by-Solid Methods	15
2.4 Polycrystalline Systems	16

3	Past Approaches to KMC Simulations of Electrodeposition	20
3.1	Single Crystal Systems	20
3.1.1	Nucleation Studies	21
3.1.2	Morphological Studies	23
3.2	Simulations of Electrodeposition	24
3.3	Multiscale Simulations	25
4	Electrodeposition onto a Single Crystal Substrate	28
4.1	Methodology	29
4.1.1	Processes	30
4.1.2	Simulation Conditions	31
4.2	Results and Discussion	35
4.2.1	Kinetics of Diffusion Events	37
4.2.2	Effect of Diffusion Mechanisms	41
4.2.3	Comparison of Equilibrium Deposits	43
4.3	Conclusions	46
5	Electrodeposition onto a Polycrystalline Substrate	47
5.1	Electrochemical Kinetics	47
5.2	Methodology	49
5.2.1	Processes	49
5.2.2	Propensity Scaling	51
5.2.3	Representation of a Polycrystalline System	52
5.2.4	Substrate Generation	54

5.2.5	Simulation Conditions	54
5.3	Results and Discussion	55
5.3.1	Effect of Domain Size	61
5.3.2	Effect of Overpotential on Roughness	64
5.4	Conclusions	66
6	Conclusions	67
6.1	Conclusions	67
6.2	Recommendations	68
	Appendix – KMC-EAM Documentation	70
	References	139

List of Tables

4.1	Propensity functions for the possible events	32
4.2	Parameters used in propensity functions for KMC-EAM	32
4.3	Average deposit cluster properties	42
5.1	Propensity functions for the possible events	50
5.2	Parameters used in propensity functions for KMC-EAM	50
5.3	Parameters used in Eqns (5.5) and (5.4)	51
5.4	Comparison of β values for copper deposition	64

List of Figures

2.1	Schematic diagram of an electrochemical cell	6
2.2	Schematics of polycrystalline system	17
3.1	Possible mechanisms for atom attachment	22
3.2	Simulation system in multiscale SBS method	27
4.1	Schematics of three possible diffusion mechanisms	30
4.2	Flowchart of KMC-EAM algorithm	34
4.3	Morphology evolution of the configuration	36
4.4	Number of diffusion events over time	39
4.5	Equilibrium morphology at $t = 5$ s	40
4.6	Effect of current density on δ_E	44
4.7	Effect of temperature on δ_E	45
5.1	Representation of a polycrystalline system	53
5.2	Flowchart of polycrystalline KMC-EAM algorithm	56
5.3	Morphology evolution when $\eta = -0.15$ V	58
5.4	Morphology evolution when $\eta = -0.10$ V	59
5.5	Morphology evolution when $\eta = -0.05$ V	60

5.6	Side view of final deposit morphology at different overpotentials	61
5.7	Grain volume/(initial volume) of the orientations with time	62
5.8	Variation of average roughness exponent with domain size	63
5.9	Variation of the average final roughness with overpotential	65
5.10	Variation of the average final roughness of grain orientation with overpotential	65

Nomenclature

α_a	Charge transfer coefficient for anodic reaction
α_c	Charge transfer coefficient for cathodic reaction
β	Power law exponent
σ	State of system
ΔE	Energy difference between final and initial states (eV)
δ_C	Difference between the mean atom coordination number of the equilibrium deposit configurations from KMC-EAM and from MD-EAM (%)
δ_E	Difference between the mean energy of the equilibrium deposit configurations from KMC-EAM and the potential energy component of the same relaxed configurations from MD-EAM (%)
δ_{ij}	Kronecker delta
η	Overpotential (V)
$\Gamma_{i,j}$	Propensity at site i due to event j (s^{-1})
γ_i	Activity of species i
\mathbf{R}	3×3 rotation matrix

\mathbf{t}	3×1 translation vector
\mathbf{x}'_i	3×1 vector representing the new coordinates of site i
\mathbf{x}_i	3×1 vector of reference coordinates for site i
\mathcal{E}	Half-cell voltage (V)
\mathcal{E}_{appl}	Applied potential (V)
\mathcal{F}	Multi-body embedding energy functional (eV)
ν	Kinematic viscosity ($\text{m}^2 \text{s}^{-1}$)
ν_{ads}	Adsorption frequency (s^{-1})
ν_a	Frequency rate (s^{-1})
ν_{desorb}	Desorption frequency (s^{-1})
ν_d	Atomic vibrational frequency for diffusion (s^{-1})
$\bar{\chi}$	Average Euler characteristic (nm^{-1})
\bar{A}	Average cluster area fraction
\bar{h}	Average height (nm)
\bar{P}	Average cluster perimeter (nm)
\bar{R}_{RMS}	Average root-mean-squared roughness (nm)
$\phi_{binding}$	Binding energy (eV)
ϕ_{ij}	Pair-wise repulsion between atoms i and j (eV)
ϕ_{ss}	Average potential energy between solid atoms (eV)
ρ_h	Function that quantifies the electron density of a neighboring atom

ρ_i	Total host electron density for atom i
A	Substrate surface area (m^2)
a	Lattice constant (nm)
a_{Cu}	Lattice constant of copper (0.3615 nm)
B	Arrhenius constant (mol s^{-1})
C	Power law constant
c	Concentration of the plating bath (mol m^{-3})
Cu	Copper
D	Diffusion coefficient ($\text{m}^2 \text{s}^{-1}$)
E	Total potential energy (Hamiltonian) of the system (eV)
e	Elementary charge ($1.602 \times 10^{-19} \text{ C}$)
e^-	Electron
E_A	Energy of the system before an event (eV)
E_B	Energy of the system after an event (eV)
E_b	Grain boundary diffusion activation energy (eV)
E_{dep}	Activation energy of deposition (eV)
E_{dep}^{chem}	Chemical potential contribution to activation energy of deposition (eV)
E_{diss}	Activation energy of dissolution (eV)
E_{diss}^{chem}	Chemical potential contribution to activation energy of dissolution (eV)
E_{exch}	Atom exchange activation energy (eV)

E_{hop}	Hopping activation energy (eV)
E_i	Interaction energy of atom i (eV)
E_{step}	Step-edge atom exchange activation energy (eV)
F	Faraday's constant (96485 C mol ⁻¹)
f_s	Substrate occupancy fraction
G	Probability per unit time (s ⁻¹)
h_i	Height of each surface atom (nm)
h_s	Substrate layer height (nm)
i	Current density (A m ⁻²)
i^0	Exchange current density (A m ⁻²)
i_{dep}	Partial deposition current density (A m ⁻²)
i_{diss}	Partial dissolution current density (A m ⁻²)
i_L	Limiting current density (A m ⁻²)
J	Generic interaction potential
k	Rate constant (mol s ⁻¹)
k_B	Boltzmann constant (8.617 × 10 ⁻⁵ eV K ⁻¹)
L	Number of possible grain orientations
m	Number of moles of metal (mol)
$M_{(aq)}^{z+}$	Metal ions in aqueous solution
$M_{(s)}^0$	Elemental metal

n	Number of atoms
n_c	Number of atoms within the potential cutoff (nm)
n_{dep}	Number of possible deposition sites per unit area (sites m^{-2})
n_{diss}	Number of possible dissolution sites per unit area (sites m^{-2})
n_{exch}	Number of atom exchange diffusion moves
n_{hop}	Number of hopping diffusion moves
n_n	Number of occupied first nearest neighbors
n_{step}	Number of step-edge atom exchange diffusion moves
$P(\boldsymbol{\sigma})$	Probability density
R	Gas constant ($8.314 \text{ J mol}^{-1} \text{ K}^{-1}$)
r	Rate of reaction (mol s^{-1})
r_{ij}	The distance between atoms i and j (nm)
R_{RMS}	Root-mean-squared roughness (nm)
T	Temperature (K)
t	Time (s)
U	Uniform random number $\in (0, 1)$
w	Angular rotation speed (rad s^{-1})
Z	Partition function
z	Number of electrons transferred in reduction

Chapter 1

Introduction

1.1 Research Motivation

The study of metal deposition continues to attract attention due to its importance to industry and nanotechnology. One method of forming metal deposits is through electrodeposition which involves reduction of metal ions in an electrolyte solution to their elemental form. This reduction process can occur either electrolytically through the application of a current/potential to the electrode surface or electrolessly through the addition of a chemical reducing agent to the plating solution [1]. Electrodeposition can be used to form protective metal coatings on surfaces [2], electrodes [3], photoelectrodes used in photovoltaic cells [4,5], catalysts [6], interconnects [7–9] and sensors [6].

When electrodeposition is used to fabricate metal or alloy coatings for devices, specific structures are desired to optimize performance. An example of this is copper interconnects where larger grains and (111) textured films are preferred to improve device longevity [10–12]. Another example is for catalysis where multimodal pore size distributions at the nano- and micron-scale are desired to increase the catalyst surface area [3]. Given the desire for specific deposit structures, it is important to study electrodeposition at the atomistic scale.

Atomistic simulations can provide information as to how process operating conditions can be varied to control the desired deposit structure. In addition to deposit morphology, atomistic simulations provide information regarding the kinetics and different phenomena such as grain growth and nucleation during the deposition process. This is extremely beneficial when aiming to understand the effects of specific phenomena on the final product. Simulations can also be performed to better design experiments to help isolate parameters of interest and validate macroscale observations at the atomic level. Phenomena at the atomic level can contribute to processes measured at the macroscale. Nucleation and growth processes are examples of phenomena that can be modelled at the atomic level [13–38].

Continuum models are appropriate for describing phenomena occurring at the macroscale or microscale but do not provide the same level of detail regarding the system as atomistic simulations. Atomistic simulation methods, such as molecular dynamics (MD), can capture the dynamics of the system down to the level of phonon vibrations. MD can also be used to determine kinetic parameters such as reaction rates. When MD is used in conjunction with a suitable interaction potential, it is a very effective method for simulation of metallic systems over a small time frame (nanoseconds) or simulation of final equilibrium states. The embedded-atom method (EAM) potential has been shown to accurately characterize metal/metal interactions [39] and predict relevant dynamics for systems including hydrogen adsorption onto nickel and segregation in binary alloys [40]. The EAM potential has been extensively validated for metallic systems [39–42] and used in MD simulations of hydrogen dissociation on nickel [42], self-diffusion of metals [40, 41, 43] and epitaxial growth [44].

A significant limitation of MD is its computational requirement since it explicitly accounts for thermal fluctuations. Thus, even with the use of parallel large-scale MD codes and a large number of parallel processors running over several days, simulations can only resolve time scales on the order of nanoseconds. Even accelerated MD methods such as hyperdynamics [45, 46] and temperature-accelerated dynamics [47, 48] are limited to small systems. Kinetic Monte Carlo methods, on the other hand, can simulate the dynamics of electrodeposition on time scales of seconds on a single-core computer over hours of computation time. Deposit morphologies and nucleation are still captured in KMC simulations,

but the required coarse-graining does not allow phonon vibrations to be considered. Based on these factors, KMC is an attractive method of simulating electrodeposition at the atomistic level.

1.2 Objectives

The overall objectives of this research are:

1. To develop a KMC method for simulating electrodeposition processes using the EAM potential.
2. To validate the KMC simulation method by comparison with experimental data reported in the literature.

To complete the aforementioned objectives, the following studies have been conducted:

1. KMC simulation of single crystal electrodeposition
 - (a) Kinetics of diffusion events and the influence of each diffusion event on deposition.
 - (b) Analysis of deposit morphology obtained from the simulations using quantitative morphological measures (Minkowski measures) to determine the effect of diffusion mechanisms.
 - (c) Direct comparison of equilibrium morphologies from KMC simulations and MD simulations.
2. KMC simulation of polycrystalline electrodeposition
 - (a) Comparison of growth kinetics to experimentally observed behaviour.
 - (b) Morphological analysis of the deposit surface and grain volume using morphological measures.

1.3 Structure of Thesis

The thesis is organized into six chapters: Chapter 2 – background, Chapter 3 – literature review, Chapter 4 – KMC simulations of electrodeposition onto a single crystal substrate, Chapter 5 – KMC simulations of electrodeposition onto a polycrystalline substrate and Chapter 6 – conclusions and recommendations.

Chapter 2 will cover the relevant theoretical background to the studies. The on-lattice kinetic Monte Carlo method is described along with the embedded-atom method potential. Fundamentals of the electrodeposition process are also described.

Chapter 3 provides an overview of the current literature on KMC simulations of electrodeposition. Previous studies involving KMC simulations of electrodeposition are summarized. The review is divided into sections based on the nature of the study (morphological studies, nucleation studies, simulations of polycrystalline systems and multiscale simulations).

Chapter 4 presents results of the first part of the study – simulations of single crystal copper electrodeposition. Morphological analysis and kinetics of diffusion events are discussed in this chapter. Validation of the KMC-EAM method with MD simulations using the EAM potential (MD-EAM) is also included in this chapter.

In Chapter 5, the KMC-EAM method presented in Chapter 4 is extended to model polycrystalline systems. Results from simulations of copper electrodeposition onto a randomly generated polycrystalline copper substrate and morphological analysis are included.

Lastly, Chapter 6 summarizes the conclusions from this work and discusses possible extensions to the work.

Chapter 2

Background

The effective use of KMC to simulate electrodeposition requires an understanding of the fundamentals of both electrodeposition and KMC. In this chapter, the basics of electrodeposition, embedded-atom method potential, on-lattice kinetic Monte Carlo and polycrystalline systems are discussed.

2.1 Electrodeposition

Electrodeposition is a process of forming metal deposits electrochemically by reduction of metal ions in an electrolyte to metal atoms. The reduction of metal ions (M_{aq}^{z+}) in an aqueous electrolyte is represented by the following reaction [1]:



The reaction proceeds when an external current or potential is applied to an electrochemical cell (Figure 2.1). In the case of the electrochemical cell in Figure 2.1, the reaction described in Eqn (2.1) occurs at the cathode. During operation, an electric potential across the electrochemical cell known as the cell voltage exists. The electrochemical cell such as the one in Figure 2.1 contains two half-cells, the anode and the cathode. The half-cells can

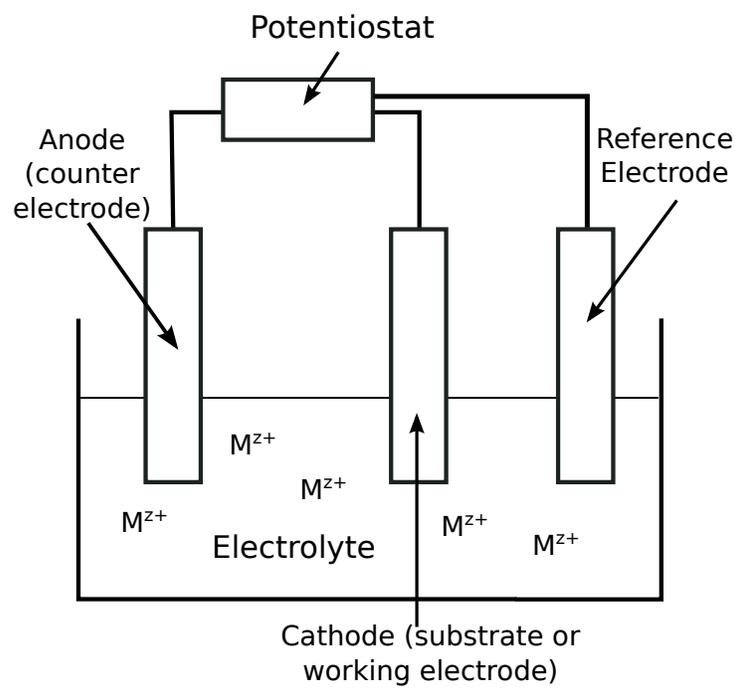


Figure 2.1: Schematic diagram of an electrochemical cell.

undergo different reactions, Eqn (2.1) is an example of a half-cell reaction that occurs at the cathode. Each half-cell reaction has a half-cell voltage (\mathcal{E}) associated to it. The half-cell voltage is a function of the equilibrium half-cell voltage and activity of the species involved in the reaction,

$$\mathcal{E} = \mathcal{E}^0 + \frac{RT}{zF} \ln \gamma_{M(aq)}^z, \quad (2.2)$$

where \mathcal{E}^0 is the standard (equilibrium) half-cell voltage measured against a reference electrode (V), $\gamma_{M(aq)}$ is the activity of the aqueous species, z is the number of electrons transferred in the reaction and F is Faraday's constant (C mol^{-1}). The voltage calculated in Eqn (2.2) is with respect to the same reference electrode that \mathcal{E}^0 is measured against. This equation is commonly known as the Nernst equation [49].

The rate at which metal is deposited on the substrate is determined by the current through Faraday's law of electrolysis [1]:

$$r = \frac{dm}{dt} = \frac{iA}{zF}, \quad (2.3)$$

where r is the rate of the electrodeposition reaction (mol s^{-1}), m is the number of moles of metal deposited, t is time, i is the current density (current per unit area, A m^{-2}) and A is substrate surface area (m^2). The reaction rate can also be expressed in terms of the activity of the species involved in reaction (2.1) [1]:

$$r = \overleftarrow{r} - \overrightarrow{r}, \quad (2.4)$$

$$\overrightarrow{r} = \overrightarrow{k} \gamma_{M(aq)}^z, \quad (2.5)$$

$$\overleftarrow{r} = \overleftarrow{k} \gamma_{M(s)}^0 = \overleftarrow{k}, \quad (2.6)$$

where k is the rate constant (mol s^{-1}) and the arrows denote the directions of the reaction based on Eqn (2.1).

The rate constants can be expressed using the Arrhenius equation [1]:

$$\vec{k} = \vec{B} \exp\left(-\frac{E_{dep}}{k_B T}\right), \quad (2.7)$$

$$\overleftarrow{k} = \overleftarrow{B} \exp\left(-\frac{E_{diss}}{k_B T}\right), \quad (2.8)$$

where B is a constant (mol s^{-1}), E_{dep} is the activation energy of deposition (eV) and E_{diss} is the activation energy of dissolution (eV). The activation energies can be expressed as the sum of the contribution due to the chemical potential and electric potential [1, 50]:

$$E_{dep} = E_{dep}^{chem} + \alpha_c z F \mathcal{E}_{appl} / e, \quad (2.9)$$

$$E_{diss} = E_{diss}^{chem} - \alpha_a z F \mathcal{E}_{appl} / e, \quad (2.10)$$

where E_{dep}^{chem} and E_{diss}^{chem} are the chemical potential contributions to the activation energy of deposition and dissolution, respectively, α_a is the charge transfer coefficient for the reverse direction of reaction (2.1) (i.e. dissolution), α_c is for the forward direction of reaction (2.1) (i.e. deposition) and \mathcal{E}_{appl} is the applied electrode potential (V). The charge transfer coefficient is a measure of the effect of the applied potential to each reaction [49]. The elementary charge (e) appears on the right-hand side of Eqns (2.9) and (2.10) to convert the units of the electric potential contribution to eV. Substitution of Eqns (2.9) and (2.10) into Eqns (2.7) and (2.8) yields:

$$\vec{k} = \vec{B} \exp\left(-\frac{E_{dep,chem}}{k_B T}\right) \exp\left(-\frac{\alpha_c z \mathcal{E}_{appl}}{k_B T}\right), \quad (2.11)$$

$$\overleftarrow{k} = \overleftarrow{B} \exp\left(-\frac{E_{diss,chem}}{k_B T}\right) \exp\left(\frac{\alpha_a z \mathcal{E}_{appl}}{k_B T}\right). \quad (2.12)$$

The e term cancels if the value of the Boltzmann constant used in units of eV K^{-1} , which is the case in this work. Thus, the partial current densities of the reactions in the forward

and reverse directions can be written as:

$$\vec{i} = \frac{zF\vec{B}\gamma_{M(aq)}^z}{A} \exp\left(-\frac{E_{dep,chem}}{k_B T}\right) \exp\left(-\frac{\alpha_c z \mathcal{E}_{appl}}{k_B T}\right), \quad (2.13)$$

$$\overleftarrow{i} = \frac{zF\overleftarrow{B}}{A} \exp\left(-\frac{E_{diss,chem}}{k_B T}\right) \exp\left(\frac{\alpha_a z \mathcal{E}_{appl}}{k_B T}\right). \quad (2.14)$$

At equilibrium, $\vec{i} = \overleftarrow{i} = i^0$ and $\mathcal{E}_{appl} = \mathcal{E}$, where i^0 is the exchange current density (A m^{-2}). From Eqn (2.1), the overall current density is $i = \overleftarrow{i} - \vec{i}$. Thus, the relationship between current density and potential can be written as:

$$i = i^0 \left[\exp\left(\frac{\alpha_a z \eta}{k_B T}\right) - \exp\left(-\frac{\alpha_c z \eta}{k_B T}\right) \right], \quad (2.15)$$

where η is the overpotential (V) [1],

$$\eta = \mathcal{E}_{appl} - \mathcal{E} \quad (2.16)$$

and the exchange current density is given as:

$$i^0 = \frac{zF\vec{B}\gamma_{M(aq)}^z}{A} \exp\left(-\frac{E_{dep,chem}}{k_B T}\right) \exp\left(-\frac{\alpha_c z \mathcal{E}}{k_B T}\right) \quad (2.17)$$

$$= \frac{zF\overleftarrow{B}}{A} \exp\left(-\frac{E_{diss,chem}}{k_B T}\right) \exp\left(\frac{\alpha_a z \mathcal{E}}{k_B T}\right). \quad (2.18)$$

Eqn (2.15) has the form of the Butler-Volmer [1, 49, 50] equation that is commonly used to describe electrochemical kinetics.

At the atomic level, the partial current densities are functions of the frequency of deposition/dissolution and the nature of the surface. Assuming that the deposition sites are all of the same type and dissolution sites are also of the same type, the relationship is

given as [51, 52]:

$$\vec{i} = -i_{dep} = ze\Gamma_{dep}n_{dep}, \quad (2.19)$$

$$\overleftarrow{i} = i_{diss} = ze\Gamma_{diss}n_{diss}, \quad (2.20)$$

where i_{dep} and i_{diss} are the partial current densities of each reaction (A m^{-2}), Γ is the frequency or propensity of the event occurring (s^{-1}), n_{dep} is the number of sites that deposition can occur at per unit area (sites m^{-2}) and n_{diss} is the number of sites that dissolution can occur at per unit area (sites m^{-2}).

2.2 Embedded-Atom Method Potential

The embedded-atom method potential is a semi-empirical potential that is based on (quantum) density functional theory (DFT) [39] and is widely used in MD simulations of metallic systems [40]. This potential closely describes the effect of metallic bonding in metal systems to accurately estimate the potential energy of an atom [40]. The potential of each atom (E_i) is composed of both multi-body and pairwise contributions [39]:

$$E_i = \mathcal{F}[\rho_i] + \frac{1}{2} \sum_{\substack{j \\ i \neq j}}^{n_c} \phi_{ij}(r_{ij}) \quad (2.21)$$

where r_{ij} is the distance between atoms i and j , E_i is the interaction energy of atom i , \mathcal{F} is the multi-body *embedding energy* functional, n_c is the number of atoms within the potential cutoff and $\phi_{ij}(r_{ij})$ is a pair-wise repulsion between atoms i and j . The function ρ_i is the total host electron density for atom i :

$$\rho_i = \sum_{\substack{j \\ i \neq j}}^{n_c} \rho_h(r_{ij}) \quad (2.22)$$

where ρ_h is a function that quantifies the electron density of a neighboring atom. The total potential energy of the system (Hamiltonian) is the sum of all of the interaction energies,

$$E = \sum_i^N \sigma_i E_i, \quad (2.23)$$

where $\sigma_i = 0$ when the site is vacant and $\sigma_i = 1$ when the site is occupied. The significance of the Hamiltonian will be discussed in the next section. The EAM parameters are estimated by fitting the predictions of the DFT calculations to known experimental values of metal properties such as the lattice constant, elastic constants, sublimation energy and vacancy-formation energy [39–42]. Since the EAM potential is based on DFT calculations, the approximations made in the DFT calculations will affect the parameters of the EAM potential.

2.3 On-Lattice Kinetic Monte Carlo Method

In MD, the exact locations of the atoms are determined and their motion is solved directly via Newton’s equations of motion [53]. However, this is computationally expensive and so is limited to evolution of the domain over short time scales. For metallic systems, it can be assumed that atoms vibrate about specific locations in quasi-equilibrium over a period of time. Since each of these locations corresponds to a minimum in potential energy of the system, an atom must overcome an energy barrier to move from one minimum to another [54]. Thus using a consistent fine-grained method, such as molecular dynamics or quantum mechanical density functional theory [54], the ground state lattice type (FCC, BCC, etc) and lattice spacing of a specific atomic system [41] are used as inputs for on-lattice KMC simulations. This is the basis of the on-lattice approximation for conducting KMC simulations of metal deposition via KMC [54], whereby the metal atoms’ positions are limited only to sites on this crystal lattice.

Utilizing the on-lattice approximation, the discretized microscopic state σ of the system is a function of only lattice site occupancy and time, where $\sigma_i = 0$ for a vacant site and

$\sigma_i = 1$ for an occupied site. In order to utilize the KMC methodology, an additional coarse-graining approximation must be used which assumes that the domain evolves through a discrete set of independent dynamic mechanisms. Furthermore, these dynamic mechanisms are assumed to be Poisson processes [55]. Given these approximations, the KMC method enables numerical solution of the master equation of the system where the probability density $P(\boldsymbol{\sigma})$ of observing state $\boldsymbol{\sigma}$ is given as [54, 55]:

$$\frac{dP(\boldsymbol{\sigma})}{dt} = \sum_{\substack{\boldsymbol{\sigma}' \\ \boldsymbol{\sigma}' \neq \boldsymbol{\sigma}}} G(\boldsymbol{\sigma}' \rightarrow \boldsymbol{\sigma})P(\boldsymbol{\sigma}') - \sum_{\substack{\boldsymbol{\sigma}' \\ \boldsymbol{\sigma}' \neq \boldsymbol{\sigma}}} G(\boldsymbol{\sigma} \rightarrow \boldsymbol{\sigma}')P(\boldsymbol{\sigma}), \quad (2.24)$$

where $G(\boldsymbol{\sigma} \rightarrow \boldsymbol{\sigma}')$ is the probability per unit time that the system will undergo a transition from $\boldsymbol{\sigma}$ to $\boldsymbol{\sigma}'$. Alternatively, Eqn (2.24) is also known as the *chemical master equation* and may be reformulated as [56]:

$$d\sigma_i = \sum_j \Gamma_{ij}^+(\boldsymbol{\sigma})dt - \sum_j \Gamma_{ij}^-(\boldsymbol{\sigma})dt, \quad (2.25)$$

where $\Gamma_{ij}(\boldsymbol{\sigma})$ is the transition probability (s^{-1}) or propensity function for process j at site i when the state $\boldsymbol{\sigma}$ is observed. The term $\Gamma_{ij}(\boldsymbol{\sigma})dt$ gives the probability of state $\boldsymbol{\sigma}$ undergoing a change due to some move j at site i within the time increment dt [57]. The ‘+’ and ‘−’ signs denote whether site i is entering state $\boldsymbol{\sigma}$ or leaving state $\boldsymbol{\sigma}$. The propensity defines the frequency at which the events occur and also defines the possible events that can occur in the system.

When the system is in equilibrium (steady-state), the time derivative of $P(\boldsymbol{\sigma}_{eq})$ is equal to zero. Eqn (2.24) becomes:

$$\sum_{\substack{\boldsymbol{\sigma}' \\ \boldsymbol{\sigma}'_{eq} \neq \boldsymbol{\sigma}}} G(\boldsymbol{\sigma}' \rightarrow \boldsymbol{\sigma})P(\boldsymbol{\sigma}'_{eq}) = \sum_{\substack{\boldsymbol{\sigma}' \\ \boldsymbol{\sigma}' \neq \boldsymbol{\sigma}_{eq}}} G(\boldsymbol{\sigma} \rightarrow \boldsymbol{\sigma}')P(\boldsymbol{\sigma}_{eq}), \quad (2.26)$$

where [55, 58]:

$$P(\boldsymbol{\sigma}_{eq}) = Z^{-1} \exp\left(-\frac{E(\boldsymbol{\sigma}_{eq})}{k_B T}\right), \quad (2.27)$$

$$Z = \sum_{\boldsymbol{\sigma}} \exp\left(-\frac{E(\boldsymbol{\sigma})}{k_B T}\right). \quad (2.28)$$

The sum of all the probabilities of the system undergoing a transition from state $\boldsymbol{\sigma}$ to $\boldsymbol{\sigma}'$ is equal to the sum of probabilities of the reverse transition. Eqn (2.26) is known as the detailed balance and is a fundamental constraint for Monte Carlo methods [53, 55, 59].

Site i and event j are randomly selected through a KMC algorithm such as the Bortz-Kalos-Lebowitz (BKL) algorithm [60]. After an event has been selected and the transition has occurred, the simulation time is updated using the following expression [55]:

$$\Delta t = -\frac{1}{\sum_i \sum_j \Gamma_{ij}} \ln(U), \quad (2.29)$$

$$t_{new} = t_{old} + \Delta t, \quad (2.30)$$

where U is a uniform random number $\in (0, 1)$. This expression relates the events in the KMC simulation to time.

2.3.1 Ising and Potts Models

The simplest example of a KMC model is the Ising spin model. The Ising model is based on the property of a ferromagnet where the atoms has two possible states: spin up and spin down [61]. This type of system can be adapted to represent the simplest form of crystal growth. In crystal growth, a site i can have two possible states, occupied ($\sigma_i = 1$) and unoccupied ($\sigma_i = 0$). The propensity function that describes the transition between the two states will be based on the kinetics of the system. An example of this is a simple

adsorption/desorption process with propensity functions as follow [54]:

$$\Gamma_{ads,i} = \nu_{ads} (1 - \sigma_i), \quad (2.31)$$

$$\Gamma_{desorb,i} = \nu_{desorb} \sigma_i \exp\left(-\frac{\phi_{binding}(i)}{k_B T}\right). \quad (2.32)$$

where $\phi_{binding}$ is the binding energy (eV) and ν_{ads} and ν_{desorb} are adsorption and desorption frequencies (s^{-1}), respectively. The Hamiltonian of the system can be described using the following expression [54]:

$$E = \sum_i^N E_i = \sum_i^N \sum_j^{n_c} J(r_{ij}) \delta_{\sigma_i \sigma_j} \quad \sigma = 0 \text{ or } 1, \quad (2.33)$$

where J can be any interaction potential and $\delta_{\sigma_i \sigma_j}$ is the Kronecker delta.

The Ising model is restricted to having two possible states, although it is possible to extend the model to Q possible states. Site i can now move between Q possible states as opposed to only two states. This Q -state model is referred to as the Potts Q -state model. In crystal growth, the Q state can refer to properties such as the misorientation angle of site i in a polycrystalline system. An example of this particular application of the Potts model is in ref. [37] where the propensity of diffusion from one site to another site with a different misorientation angle is represented by the following:

$$\Gamma_{d,i} = \nu_d \exp\left(-\frac{E(\sigma_{init}, \sigma_{final})}{k_B T}\right), \quad (2.34)$$

where the energy barrier is a function of the states of both initial and destination sites. In the Potts model, the Hamiltonian is given as [62]:

$$E = \sum_i^N E_i = \sum_i^N \sum_j^{n_c} J(r_{ij}) \delta_{\sigma_i \sigma_j} \quad \sigma = 0, 1, \dots, Q. \quad (2.35)$$

In the case of polycrystalline crystal growth, the Hamiltonian would be modified to include

interactions between sites of different states,

$$E = \sum_i^N E_i = \sum_i^N \sum_j^{n_c} J(r_{ij}, \sigma_i, \sigma_j) \quad \sigma = 0, 1, \dots, Q. \quad (2.36)$$

2.3.2 Solid-on-Solid and Solid-by-Solid Methods

One of the most widely-used methods of simulating crystal growth through KMC is the solid-on-solid (SOS) method developed by Gilmer and Bennema [63]. The term solid-on-solid comes from the fact that particles are treated as blocks that can stack on top of each other during crystal growth [58]. The SOS method is a ‘2+1’ dimensional method where the simulation domain is two-dimensional but at each site there exists a height parameter that represents the surface morphology [54, 63]. The propensity of adsorption/deposition events depends on the kinetics of the system while the propensity of surface diffusion events and desorption/dissolution events are determined by the number of occupied first nearest neighbors [58, 63]:

$$\Gamma_{dep} = \nu_a \exp\left(\frac{E_{dep}}{k_B T}\right), \quad (2.37)$$

$$\Gamma_{diss} = \nu_a \exp\left(-\frac{n_n \phi_{ss}}{k_B T}\right), \quad (2.38)$$

$$\Gamma_{diff} = \nu_d \exp\left(\frac{E_A - E_B}{k_B T}\right), \quad (2.39)$$

where ν_a is the frequency rate of the event (s^{-1}), ϕ_{ss} is the average potential energy between solid atoms (eV), n_n is the number of occupied first nearest neighbors, ν_d is the atomic vibrational frequency for diffusion (s^{-1}) and E_A and E_B are energies of the system before and after the event (eV). E_A and E_B are also functions of n_n , the solid-solid, fluid-fluid and solid-fluid interaction energies [63]. The Hamiltonian also depends on n_n , the solid-solid, fluid-fluid and solid-fluid interaction energies and the state of the system [58].

While the SOS method requires less computational time than other KMC methods, this advantage comes at the expense of accuracy. The approximation that the interaction energy

depends only on the number of occupied first nearest neighbors is insufficient in metallic systems where the nature of metallic bonding implies a multi-body interaction. Another deficiency in the SOS method is the lack of vacancies in the deposit due the restriction that the particles must stack on top of another particle and not on a vacant block [27, 64]. Kaneko and coworkers [23–27] extended the SOS model to account for vacancy formation in the deposit. This solid-by-solid (SBS) method uses propensity functions that are based on Eqns (2.37), (2.38) and (2.39).

2.4 Polycrystalline Systems

Electrochemical experiments are commonly conducted on polycrystalline substrates so that many metal grains form and interact with each other during electrodeposition. In order to represent polycrystalline systems, more than one grain must be included in the simulation domain. Phenomena such as grain boundary migration (diffusion of atoms across grains) [65] and grain boundary diffusion (diffusion of atoms along grain boundaries) [66] must be taken into account along with deposition, nucleation and surface diffusion. In addition, the deposit will also contain grains that are at different orientation angles from each other. This orientation must also be taken into account in the simulation. These factors are some of the complexities in simulating polycrystalline systems that have been addressed in some form or another by researchers modeling electrodeposition and other modes of deposition. In this section, the different factors in simulations of polycrystalline systems are discussed with respect to a generic deposition process.

In polycrystalline systems, unaligned grains typically nucleate on a deposit surface [67]. Each grain can be described in terms of a misorientation angle, defined as the angle that it is rotated with respect to some reference lattice. This grain misorientation can be taken into account by either assigning a misorientation angle to each site relative to one grain that is arbitrarily chosen to serve as a reference [37, 68–72] or having different lattices with coordinates that are based on the grain misorientation angle [34, 35, 73–76]. The first approach is based on the Potts model, where the Q -state is now the misorientation angle.

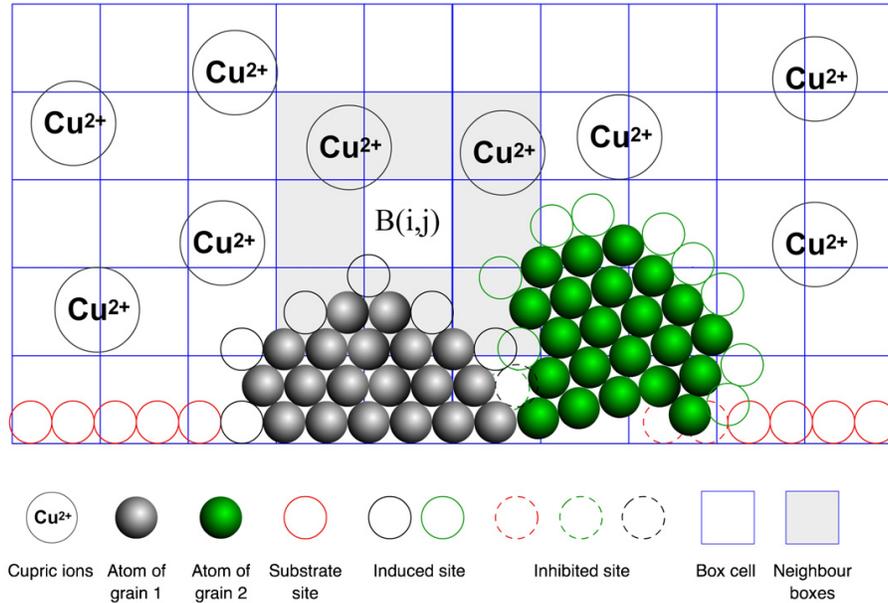


Figure 2.2: Schematics of polycrystalline system modelled in ref. [34].

Although it only requires one lattice to be generated, the morphology obtained from Potts-type simulations will not accurately reflect that of actual polycrystalline systems due to the system only having one physical lattice. The alternative approach is to define a separate lattice for each grain. The coordinates of the atoms in each grain now have a misorientation angle associated with them. Figure 2.2 shows an example of this implementation. The sites in the lattices can now overlap and impinge on each other. This approach clearly gives a more realistic description of the system than that based on Potts-type models, but of course has the downside of being much more complex and requiring additional routines to track the growth of each lattice.

In metallic systems, an atom can diffuse from its location in one grain to another grain, causing the grain boundary to migrate. The rate of migration is temperature-dependent that can be modelled in terms of an Arrhenius-type relationship [65]. In some KMC models of deposition, surface diffusion is restricted to occur within a single grain [77, 78] and thus diffusion across grains is not taken into account. This approach simplifies the model and

reduces the computational cost. However, given that grain boundary migration can become very important to the deposit morphology especially as the temperature increases, this particular mechanism should not be ignored.

Grain boundary migration can be taken into account in two ways by either ‘switching’ the grain in which the atom is contained [37, 68–72] or permitting atoms to diffuse to a new site in a different grain [73–76]. Grain switching is the simpler approach since the only change is in the grain ‘number’ attributed to the atom. The transition probability of grain switching is given by an Arrhenius-type relationship where the activation energy is often taken to be the same as for diffusion but with an added grain boundary energy contribution [68–71]. This method is typically used in simulations where only one lattice is being considered and the atom coordinates are related to a reference coordinate. In this case, movement between grains occurs over a distance similar to that involved during surface diffusion within one grain and grain boundary migration involves essentially one atom switching its grain assignment.

As stated previously, the alternative method allows an atom to diffuse to a new site in a different grain [73–76]. This approach is used when the simulation takes into account the misorientation of the grains by having the atom coordinates reflect the actual location of the atoms as opposed to some reference coordinate. During grain boundary migration, atoms will diffuse across the grain boundary to a site within the lattice of the destination grain with some transition probability. The coordinates of the destination site are based on the misorientation of the grain. As a result of this misorientation of the lattices, the distance between the initial and final sites may not be equal to that between the two sites in a reference lattice. This approach is a more accurate way of representing grain boundary migration in polycrystalline systems than the grain switching approach.

The activation energy of grain boundary migration is obviously different from the activation energy of surface diffusion. This activation energy can be taken as the activation energy of surface diffusion with an added fixed energy barrier contribution from the boundary [37, 71, 73]. The more frequent approach is to include both a migration barrier and a difference in energy of the initial and final states [34, 35, 68–70, 72, 76]. This energy difference will account for the increase in activation energy when the event in question increases

the energy of the system. The contribution of the energy difference is only considered if the diffusion event results in an increase in the total energy of the system. This approach is based on transition state theory [79] and is discussed in detail in refs [80, 81].

Chapter 3

Past Approaches to KMC Simulations of Electrodeposition

In the previous chapter, the theoretical background of KMC simulation of electrodeposition is discussed. In this chapter, the past approaches to KMC simulation of electrodeposition are discussed in a comprehensive literature review. The review is separated into three main sections: Section 3.1 – single crystal systems, Section 3.2 – polycrystalline systems and Section 3.3 – multiscale simulations.

3.1 Single Crystal Systems

The majority of the KMC studies of electrodeposition have considered single crystal systems. Since phenomena associated with grain boundaries, such as dislocations and energy effects, are neglected, single crystal systems are simpler to model than polycrystalline systems. However, in industrial applications, single crystals are not as commonly used as polycrystalline systems. Also, the formation of single crystal deposits requires different operating conditions from that of polycrystalline deposits [82]. The following section provides an overview of recent studies of single crystal systems including phenomena such as nucleation and morphological evolution of deposits.

3.1.1 Nucleation Studies

Two mechanisms describe the early stages of nucleation – instantaneous nucleation and progressive nucleation. Instantaneous nucleation occurs when a discrete set of possible nucleation sites are instantaneously assumed to become viable nuclei [1]. Given that the possible deposition sites are the same as possible nucleation sites at the onset of deposition, all of the possible deposition sites on the surface of the substrate will become occupied. Progressive nucleation occurs when the possible nucleation sites continuously form nuclei over time. In this case, the rate of formation of nucleation sites is a function of time, a rate constant, and total number of possible nucleation sites [1].

The study of nucleation of metals usually involves the deposition of less than one monolayer of atoms over a short period of time. Simulations of nucleation can be used to examine the effect of process parameters on the nucleation type (progressive versus instantaneous) and cluster formation. Additionally, the simulations have been compared with known theories of nucleation for specific conditions.

Simulations of nucleation have been conducted using the SOS approach, where the simulation time is restricted such that only sub-monolayer growth occurs. Stephens and Alkire [13] developed a method based on the SOS method to study the formation of step-edges and nucleation on a clean face-centred cubic (FCC) metal surface. The morphology of the simulated deposit was found to depend on the activation energy of surface diffusion. The SOS method was also used by Drews et al. [14] to investigate nucleation and the behaviour of the system at low overpotentials when deposition had not extended past the first monolayer. The energy barrier was determined based on the number of metal and substrate atoms that formed the nearest neighbours of the metal atom undergoing surface diffusion. From the study, the average number of clusters per unit surface area was found to increase when the ratio of the metal-(foreign) substrate surface diffusion energy barrier to metal-metal surface diffusion energy barrier was low.

Alternatively, descriptive potentials such as the EAM potential have also been used in place of the SOS method to study nucleation. In two studies by Gimenez et al. [16,17], two-dimensional KMC simulations with the EAM potential as the interaction potential were

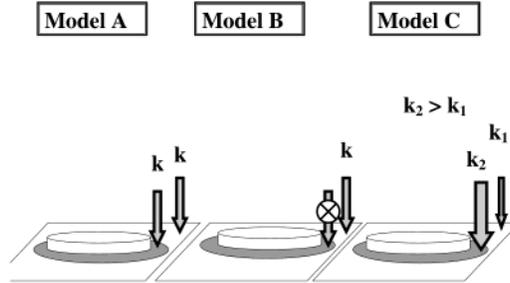


Figure 3.1: Possible mechanisms for atom attachment and their relative rates studied in ref. [17].

used to study deposition of silver onto a gold substrate. Deposition was carried out at an arbitrary rate and the activation energy for surface diffusion was previously set for different atomic configurations. The first study focused on phase formation for a Frank-van der Merwe system (layer-by-layer growth) on two different surface orientations, Au(100) and Au(111) [16]. The model predicted that growth would occur on the Au(100) surface, but not on Au(111), which contradicts the thermodynamics of the system. The second study focused on simulation of potentiostatic electrodeposition where three different conditions for adatom deposition were considered (Figure 3.1). The conditions are the following:

1. deposition rate is uniform across the domain,
2. deposition only occurs at sites with vacant nearest neighbours,
3. deposition rate at sites with occupied nearest neighbours is higher than at sites with no occupied nearest neighbours [17].

The results from the three cases were found to fit an exponential expression of the surface coverage versus time relationship for each of the three modes.

The EAM potential is not the only descriptive interaction potential that can be used. Frank et al. [18] utilized a different multi-body interaction potential based on DFT. In this study, both KMC and grand-canonical Monte Carlo methods were used to simulate the early stages of Co-Ni alloy electrodeposition. The energies of the different atomic

configurations (i.e. the number of occupied neighbours within a cutoff distance) were stored in a look-up energy table used to calculate system energy during the simulation. Kinetic parameters used were estimated to ensure that the simulations matched the experimental current-potential data for Co-Ni alloy electrodeposition on a glassy carbon substrate.

In many cases, a simulation method for nucleation was presented and validated with existing theories. Guo et al. [21] introduced an alternative KMC model that is not based on the SOS method and accounts for ion diffusion in the bulk to the electrode via Brownian motion coupled to metal deposition determined using KMC. Arbitrary deposition frequencies were used and the simulated results were compared to known mathematical models for nucleation. Frank et al. [19] used a lattice-gas model to simulate nucleation during metal deposition to study the influence of nearest neighbour diffusion on surface coverage. The results were compared to that obtained using the Kolmogorov-Johnson-Mehl-Avrami (KJMA) theory of nucleation. The quasi-equilibrium distribution of clusters obtained from KJMA theory was found to be in agreement with simulation results. In a subsequent work, Frank and Rivkold [20] performed KMC simulations of nucleation using a two-dimensional Ising lattice-gas model to study the influence of surface adsorbate diffusion on phase change. The results were compared to KJMA theory for progressive and instantaneous nucleation. Classical nucleation theory has also been used to relate the KJMA theory to a KMC model [22]. The theory was extended to include kinks and cluster configurations, resulting in the extended classical nucleation theory. Predictions from the extended classical nucleation theory were found to be in good agreement with KMC results.

3.1.2 Morphological Studies

Simulations of the evolution of the morphology of coatings during electrodeposition are complicated by the fact that they involve longer time scales than that those needed for simulation of nucleation. Thus, considerable focus of KMC studies on deposit morphology has been to develop a method that accurately describes the behaviour of the system over longer time scales. The common properties used to characterize the deposit morphology

are surface roughness, cluster density and average cluster size. These parameters are dependent on operating conditions and kinetic parameters which are adjustable in KMC simulations.

The group of Braatz and Alkire has performed several morphological studies of copper electrodeposition using KMC with the SOS method [15, 30–32]. The method used by the group is a multiscale approach, as discussed in Section 3.3. Another morphological study using a method very similar to the SOS method was conducted by Liu et al. [36]. They carried out two-dimensional KMC simulations of the cross-section of single crystal copper electro-deposits to study their morphological properties. They estimated the activation energy for surface diffusion from the energy of the metal-metal bond, energy of metal-substrate bond and number of occupied nearest neighbours, an approach similar to that used in the SOS method. The operating conditions – electroplating bath concentration, temperature and applied electrode potential – were found to affect the evolution of deposit cluster density and cluster size over time. As the plating bath concentration and applied electrode potential are decreased, the cluster density profile and variance of cluster size profile change more gradually with respect to time. Kaneko et al. [23–27] used the SBS method to account for the possible formation of vacancies in the deposit. Simulations were carried out for different metallic systems and structures, including superfilling of copper in sub-micron features involved in the fabrication of electronic devices and interconnects [23–25].

3.2 Simulations of Electrodeposition

Due to their complexity, polycrystalline systems have not been modelled as frequently as single crystal systems. As of this review, the only reported KMC simulations of the electrodeposition of polycrystalline systems have been restricted to two-dimensional studies. Liu et al. [34, 35] developed a cross-sectional two-dimensional KMC method for polycrystalline systems based on their previous work on single crystal systems [36]. Figure 2.2 describes the system modelled including how data are stored in this method. Correction

factors were introduced to account for the grain boundary energy, while grain orientations were determined randomly. Simulations of copper electrodeposition onto gold and copper substrates were performed under potentiostatic conditions. The morphologies were found to qualitatively agree with those observed in experimental studies of the same systems.

The EAM potential was also used to describe the interactions within a polycrystalline coating produced by kinetically controlled nickel electrodeposition under the presence of hydrogen impurities incorporated in the deposit in a study by Huang et al [37]. The effects of operating conditions (electrolyte temperature and deposition rate) on surface roughness, deposit grain size and relative grain density were examined. Relative grain density is a measure of the ratio of occupied sites in a grain to the maximum number of occupied sites in the same grain. As the electrolyte temperature increases, the relative grain density and average grain size increase. The opposite trend is observed when the deposition rate is increased, with the two measures decreasing almost linearly with deposition rate. Surface roughness is found to increase with an increase in deposition rate and decrease with an increase in electrolyte temperature.

3.3 Multiscale Simulations

Similar to polycrystalline systems, multiscale studies do not feature as prominently in the area of KMC simulations of electrodeposition. The majority of the work done on this topic was reported by Braatz and Alkire’s group. Their approach involved coupling ‘2+1’ dimensional simulations with the SOS method for the electrodeposition process to a continuum model for transport and aqueous chemistry in the bulk solution [15, 30]. In the earlier versions of the model, the KMC portion was coupled with a one-dimensional continuum model for the solution. The studies focused on copper electrodeposition on a flat copper surface. The presence of dissolved additives (polyethylene glycol and 3-mercaptopropyl-propane sulfonic acid) that are commonly incorporated in plating baths to help control deposit composition and morphology was not considered in the first study [30], but was included in the subsequent one [15]. The results of both studies did not agree with experimental observations for electrodeposition of copper onto a copper substrate [15, 30]. In the

case of ref. [15], the roughness evolution of the deposit did not agree with experimental observations while in ref. [30], the morphology obtained did not agree with those observed experimentally. This approach was later expanded [31–33] to simulate copper electrodeposition with additives. This involved coupling a KMC model for electrodeposition with a three-dimensional finite volume model for transport and solution chemistry in the bulk electrolyte [31]. Results from ref. [31] were used to perform parameter estimation of the rate constants by comparison of simulated and experimental data of roughness evolution and current-time transients. The use of the estimated parameters improved the agreement between experimental results and simulation results [32].

Additionally, Kaneko et al. [28] were successful in coupling MD with their SBS KMC method to model silver electrodeposition from a silver nitrate bath in the presence of arbitrary spherical polymeric additives. In their approach, transport of ions in the solution was modelled using MD, while the surface reaction was modelled using KMC. The KMC model described the deposit growth with kinetics affected by ion transport within the solution determined by MD. The influence of additives was considered in a similar approach used by others [31, 32] where an additive has an ‘action’ range within which sites are affected by the additive. Due to their complexity, the additives are excluded from the molecular dynamics simulation. The conditions in refs. [31, 32] were also simulated using a three-dimensional SBS method coupled with the coarse-grained random walk method [23]. The random walk method accounts for ion and additive transport in the solution. The simulation system is described in Figure 3.2 and the model was able to replicate the bottom-up filling required in trenches during damascene Cu electroplating [7].

Based on the literature reviewed in this chapter, only a few three-dimensional KMC methods have been reported. The existing SOS- and SBS-based models are inadequate in their ability to represent a metallic system. The short-comings of the two methods were discussed in detail in Section 2.3.2. Current approaches in representing polycrystalline systems do not involve three-dimensional KMC simulations with a highly descriptive interaction potential like the one developed in this research.

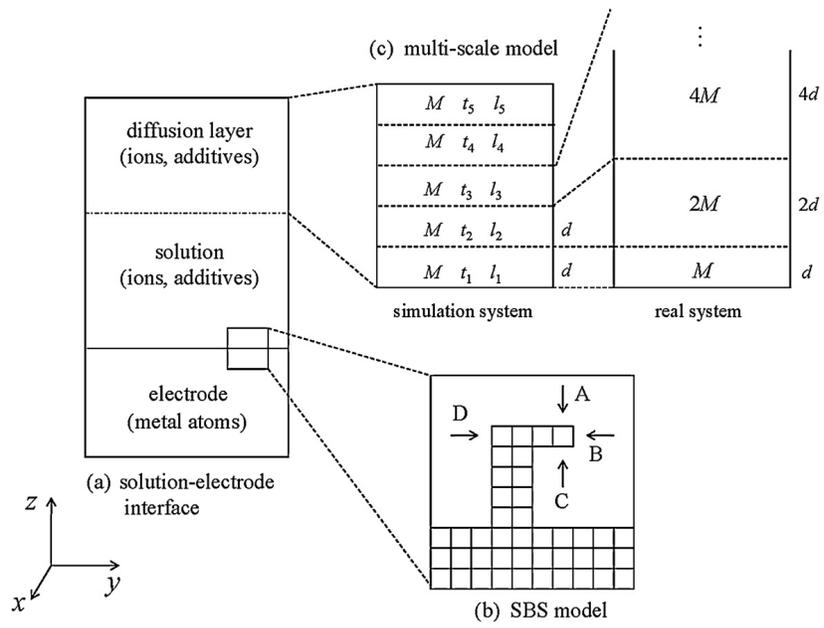


Figure 3.2: Simulation system in ref. [23].

Chapter 4

KMC-EAM Simulations of Electrodeposition onto a Single Crystal Substrate¹

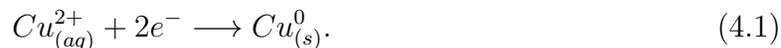
The first step in developing a KMC method for simulating electrodeposition using the EAM potential (KMC-EAM) is to develop a method for single crystal systems. Single crystal systems have just one grain and thus grain boundary diffusion and grain boundary migration can be neglected. In this chapter, the single crystal KMC-EAM method is presented and applied to three-dimensional galvanostatic electrodeposition of a copper single crystal. The method is then validated by comparison with the equilibrium microstructures obtained by MD simulations with the EAM potential as the interaction potential (MD-EAM). The MD-EAM method relaxes a number of the constraints and assumptions of the KMC-EAM method: the on-lattice approximation, finite diffusion mechanisms and temporal coarse-graining. The simulations are conducted over a range of current densities and temperatures that match common experimental conditions. Simulations are then performed within these parameter ranges to predict the effect of current density and tem-

¹The material in this chapter forms the basis for the published article T. Treeratanaphitak, M. D. Pritzker, and N. M. Abukhdeir. Kinetic Monte Carlo simulation of electrodeposition using the embedded-atom method. *Electrochim. Acta*, **121**, 407–414, 2014.

perature on surface morphology.

4.1 Methodology

The example chosen to apply and assess KMC-EAM in this work is copper electrodeposition onto a copper substrate (working electrode) from an acidic sulfate solution. The overall reaction for the cathodic reduction of Cu^{2+} is:



Cu^{2+} ion reduction proceeds through consecutive single-electron transfer steps and involves the formation of an intermediate in which Cu has oxidation state +1 [83, 84]. However, numerous studies have shown that the first of these steps has much slower kinetics than the second when copper deposition is carried out in acidic sulfate solutions [84]. Thus the first step is rate-determining [83, 84] and the two steps effectively occur almost simultaneously under these conditions. In this study, the deposition mechanism is assumed to be kinetically controlled. Thus, transport of Cu^{2+} within the solution to the electrode surface has no influence on the deposition rate and so only phenomena occurring on the copper surface are considered in the model and simulations.

The EAM interaction potential parameters for copper are taken from Adams et al [41]. This potential is expressed as a function of the atom separation distance in the form of cubic splines, one for the embedding term and one for the pair-wise repulsion term. The energy of each atom is obtained by interpolating these splines according to the separation distance between the atom and each of its neighbours for both embedding energy and pair-wise repulsion contributions to the EAM potential. The neighbour contribution is limited to atoms within a cutoff distance of 0.495 nm, as is consistent with EAM parameters obtained from Adams et al [41]. The lattice used for KMC-EAM simulations is consistent with the EAM parameters for copper. This lattice type is FCC with a lattice spacing of 0.3615 nm which was determined experimentally and was one of the properties to which the EAM potential was fitted [41].

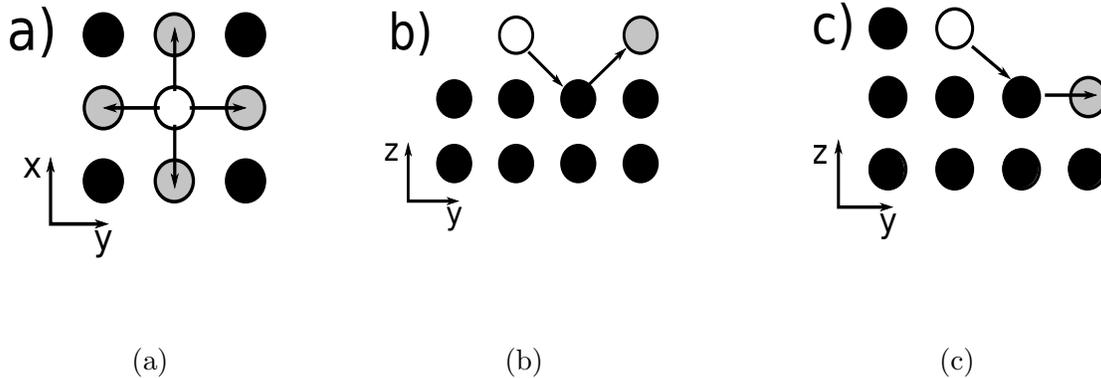


Figure 4.1: Schematics of three possible diffusion mechanisms: a) hopping b) atom exchange and c) step-edge atom exchange. White denotes an adatom, grey denotes the new location of the adatom, and black denotes an occupied site. Note that the atom locations are not drawn to scale.

4.1.1 Processes

In this work, two dynamic processes are considered in modelling copper electrodeposition: i) reduction of metal ions and deposition onto the surface as adsorbed atoms (adatoms) and ii) diffusion of these adatoms on the surface. Diffusion in the bulk of the electrode is not considered since simulations are performed under conditions in which very few vacancies form [85]. Lattice relaxation mechanisms are not considered because the on-lattice approximation is used. Diffusion of adatoms on the deposit surface is complex and involves several collective mechanisms (concerted mechanisms) [43], in addition to nearest neighbour hopping.

Three possible adatom surface diffusion mechanisms (shown in Figure 4.1) are included in the model: hopping (single), atom exchange (collective) and step-edge atom exchange (collective). Hopping (Figure 4.1a) involves the diffusion of single adatoms and kink atoms, identified by coordination number ≤ 6 [51], to unoccupied nearest neighbour sites. Most previous simulations include only this mechanism [13, 32, 34–36, 72, 76].

Atom exchange (Figure 4.1b) involves the simultaneous i) displacement of a sub-surface crystalline atom by a nearest neighbour adatom and ii) the hopping of the sub-surface crystalline atom to an unoccupied nearest neighbour site at the surface. Thus, an adatom and sub-surface crystalline atom exchange states so that the sub-surface atom becomes an adatom, while the adatom becomes part of the bulk [43].

A special case of atom exchange occurs when the exchange occurs at the edge of a terrace/step in the surface; this atom exchange process is called step-edge atom exchange (Figure 4.1c). Unlike the previously described atom exchange mechanism, the sub-surface atom hops horizontally within the same layer. The adatom becomes part of the surface crystal and sub-surface atom becomes either an adatom or a kink site depending on the coordination number of its new site.

The propensity functions for each type of diffusion event, used in the KMC-EAM method, are given in Table 4.1 [72]. The numerical values of the parameters contained in the propensity functions used in this work are given in Table 4.2. The activation energies are assumed to be constant regardless of the atomic configuration. The ΔE term in the propensity functions is evaluated using the EAM potential. The deposition propensity (Eqn (4.2)) is obtained from the relationship between the partial current density (i_{dep}) and deposition frequency given by Budevski et al [51]. The projected surface area of the domain in the $x - y$ plane is used to calculate the values of n_{dep} and n_{diss} . This is an approximation of the surface area of the deposit which continually changes during the deposition process. Furthermore, simulations are restricted to copper deposition occurring at low enough currents that transport of Cu^{2+} from the electrolyte to the cathode has no influence on the process.

4.1.2 Simulation Conditions

KMC-EAM simulations are carried out for a slab geometry that is infinite in the $x - y$ plane on which deposition occurs and semi-infinite in the z direction normal to this plane. Periodic boundary conditions are assumed in the $x - y$ plane to approximate an infinite plane. The copper substrate surface is of the (100) orientation. In addition to the process

Table 4.1: Propensity functions for the possible events

Mechanism	Propensity Function	
Deposition	$\Gamma_{i,dep} = \frac{i_{dep}}{-ze n_{dep}}$	(4.2)
Hopping	$\Gamma_{i,hop} = \begin{cases} \nu_d \exp\left(-\frac{E_{hop}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{hop} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$	(4.3)
Atom exchange	$\Gamma_{i,exch} = \begin{cases} \nu_d \exp\left(-\frac{E_{exch}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{exch} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$	(4.4)
Step-edge atom exchange	$\Gamma_{i,step} = \begin{cases} \nu_d \exp\left(-\frac{E_{step}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{step} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$	(4.5)

Table 4.2: Parameters used in propensity functions for KMC-EAM.

Parameter	Definition	Value
n_{dep}	number of possible deposition sites per unit area	varies [=] sites m^{-2}
e	elementary charge	1.602×10^{-19} C
z	number of electrons transferred in reduction reaction	2
ν_d	atomic vibrational frequency	2×10^{13} s^{-1}
E_{hop}	hopping activation energy	0.5 eV [43]
E_{exch}	atom exchange activation energy	0.7 eV [43]
E_{step}	step-edge atom exchange activation energy	0.2 eV [43]

and material parameters presented above, input parameters for the simulations include the initial copper substrate seed layer height h_s and the occupancy fraction f_s . The simulation domain sizes used range from $25a \times 25a \times 15a$ to $50a \times 50a \times 15a$ ($a_{Cu} = 0.3615$ nm is the lattice constant of copper [41, 86]).

During the first stage of the simulation, 2.5×10^4 atoms are deposited at different deposition rates and allowed to diffuse. Following deposition of all the atoms, simulation continues (in the absence of further deposition) until the system reaches equilibrium. Equilibrium is identified when the change of the mean energy of the system with respect to time approaches zero with a tolerance of 1%.

The equilibrium configuration predicted by KMC-EAM in each case is evaluated by comparing it to the configuration obtained from a simulation using an established MD-EAM method. This is done to validate the equilibrium state obtained from KMC-EAM and not the dynamics predicted by KMC-EAM. This MD-EAM simulation uses the equilibrium configuration predicted by KMC-EAM as its initial condition and involves no further deposition to relax the constraints imposed by on-lattice KMC as described in Section 2.3. The MD-EAM simulations are carried out using the canonical ensemble (constant number of atoms, volume and temperature) at the same temperature as the corresponding KMC-EAM simulation over a period of 6 nanoseconds, which is sufficient for the relaxation of KMC constraints. The resulting configuration is then compared to that from KMC-EAM on the basis of the i) equilibrium energy per atom and ii) average coordination number.

The KMC simulation package that is the basis of the method is the Stochastic Parallel Particle Kinetic Simulator (SPPARKS:spparks.sandia.gov) [87]. The Gibson-Bruck [88] implementation of the direct Gillespie method is used to evolve the system. The KMC-EAM algorithm is illustrated in the flowchart in Figure 4.2. The MD simulation package used for comparisons of equilibrium deposits is the Large-scale Atomic/Molecular Massively Parallel Simulator (LAMMPS:lammmps.sandia.gov) [89]. A MD-EAM run making use of 24 CPU cores typically requires a duration of several days to simulate 6 nanoseconds of relaxation, while KMC-EAM requires only 1 CPU and ~ 12 hours to complete a simulation in which 5 seconds of electrodeposition are modelled.

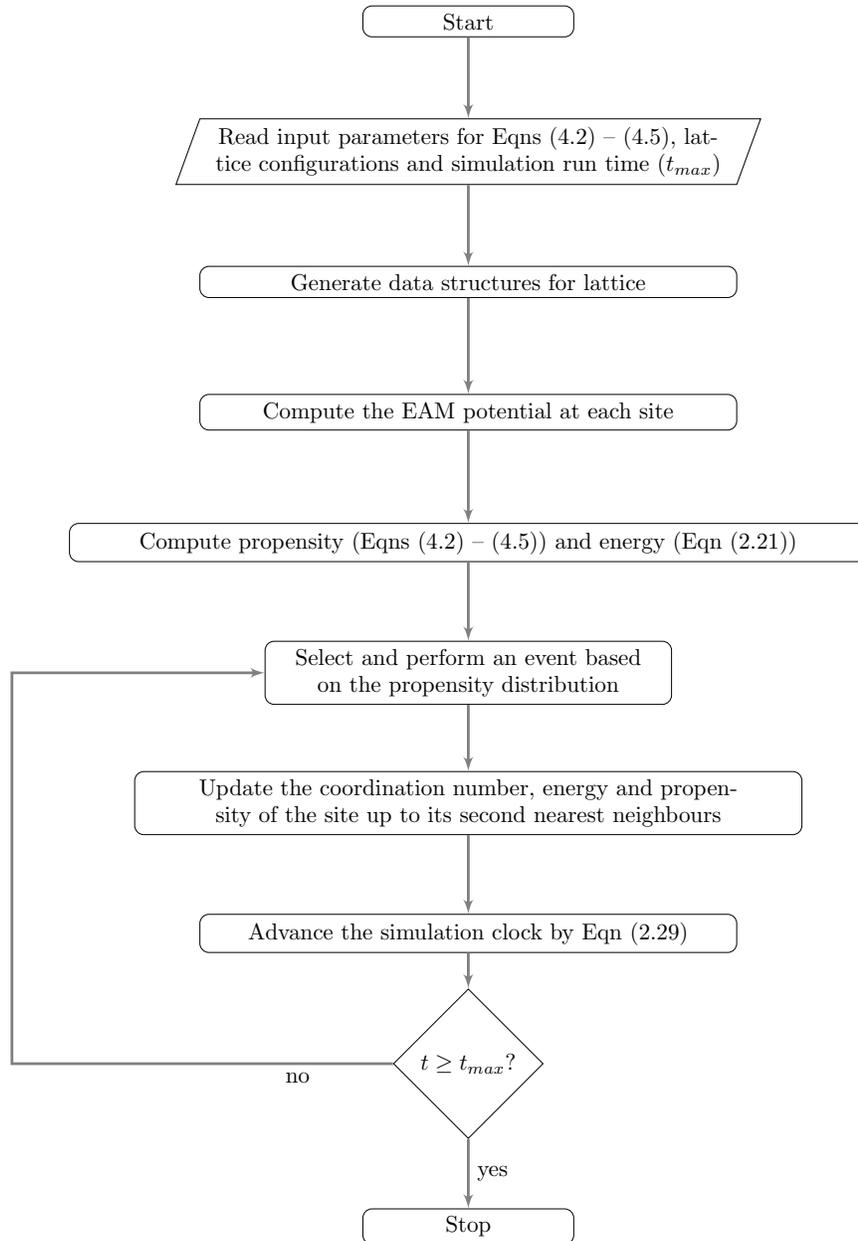


Figure 4.2: Flowchart of KMC-EAM algorithm

4.2 Results and Discussion

KMC-EAM simulations are performed to model electrodeposition of a fixed number (2.5×10^4) of copper atoms for different sets of initial conditions which govern deposition rates. These initial conditions include domain size, thickness of the substrate layer and occupancy fraction of the substrate layer. Once deposited, the atoms are allowed to diffuse over the surface via the three mechanisms described in Figure 4.1.

Simulations are conducted over a range of deposition current densities and operating temperatures. Temperatures between 300 – 330 K are considered to span typical operating conditions used in industry and experimental studies. Current densities ranging from -10 A m^{-2} to -1000 A m^{-2} are chosen to span conditions from low to high deposition rates. This study is restricted to conditions where the deposition rate is kinetically controlled and unaffected by mass transfer. The Cu^{2+} concentration in the bulk is assumed to be 1 mol dm^{-3} to ensure that deposition remains in the kinetically controlled regime for all current densities applied in the simulations. At this bulk concentration, the highest current density of -1000 A m^{-2} considered is less than 20% of the limiting current density for copper deposition onto a disk electrode rotating at 1000 RPM, as estimated using the Levich equation [49, 90]:

$$i_L = 0.620zFD^{2/3}w^{1/2}\nu^{-1/6}c. \quad (4.6)$$

In this expression, i_L is the limiting current density (A m^{-2}), D is the diffusion coefficient ($\text{m}^2 \text{ s}^{-1}$), w is the angular rotation speed (rad s^{-1}), ν is the kinematic viscosity ($\text{m}^2 \text{ s}^{-1}$) and c is the concentration of the plating bath (mol m^{-3}). The initial occupancy fraction f_s in the substrate layer is taken to be 1.0 in every simulation, while the initial copper substrate layer height h_s is set to 1.1 nm. Sample electrodeposition deposit morphology evolution from a KMC-EAM simulation is shown in Figure 4.3.

The first set of results focuses on the influence of the different surface diffusion mechanisms considered in the KMC-EAM method on the resulting deposit roughness and nanoscale morphology. In particular, a comparison is made between the coatings obtained when surface diffusion occurs by hopping alone to those obtained when all three surface diffusion mechanisms operate. Equilibrium deposit morphologies were characterized using

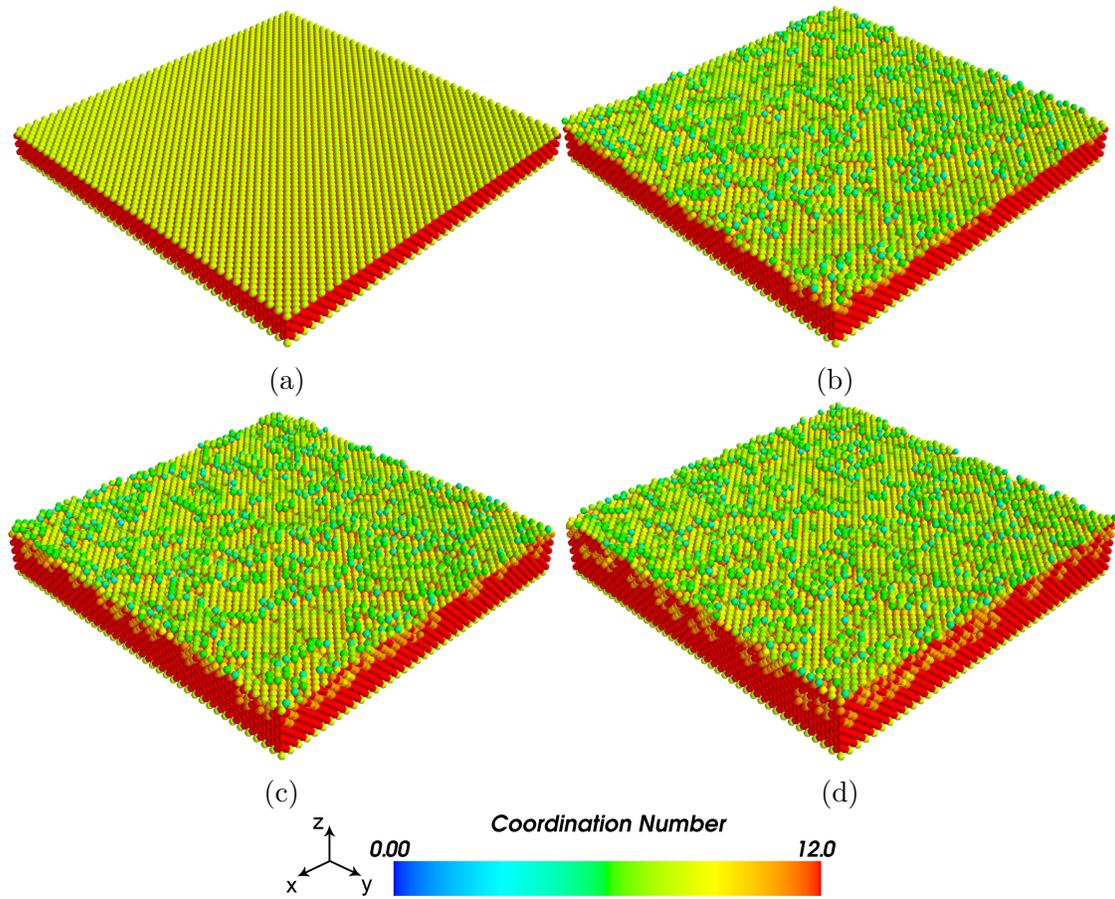


Figure 4.3: Morphology evolution of the configuration from KMC-EAM simulation at a) 0 s, b) 0.1 s, c) 0.2 s, and d) 0.3 s. The current density is -1000 A m^{-2} and the operating temperature is 300 K. Colours denote coordination number (blue to red in ascending order). The substrate surface area is $40a_{Cu} \times 40a_{Cu}$ ($\approx 210 \text{ nm}^2$).

root-mean-squared roughness and local morphological measures – area, perimeter and average curvature. More detail on the evaluation of these morphological quantities and their meaning for deposit surfaces is provided in Section 4.2.2.

The second set of results involves the use of equilibrium deposit configurations from KMC-EAM, which correspond to electrodeposition over experimentally relevant timescales (seconds), as initial conditions for MD-EAM simulations. These MD-EAM simulations were used to determine the approximation error associated with the assumptions required for KMC-EAM – the on-lattice approximation, limitation of diffusion mechanisms and time coarse-graining – since these assumptions are not made in MD-EAM. The effect of the variation of the deposition rate and temperature on the accuracy of KMC-EAM was then determined in this way.

In order to characterize the kinetics of the deposition process, the mean energy and average coordination number of the configurations are used. A consideration in comparing KMC-EAM and MD-EAM results is that KMC does not explicitly account for the average kinetic energy of the atoms. Thus, the potential energy contribution to the total energy from MD-EAM is compared to the mean energy from KMC. The average absolute relative energy difference per atom (δ_E) and average absolute relative coordination number difference (δ_C) between KMC-EAM and MD-EAM are used as a measure of how equilibrium configurations from the KMC-EAM method compare to equilibrium configurations from MD-EAM. The average root-mean-squared displacement per atom (RMS displacement) in MD-EAM simulations is utilized as a means of tracking the distance atoms travel from their starting configuration, which corresponds to the equilibrium configuration from KMC-EAM.

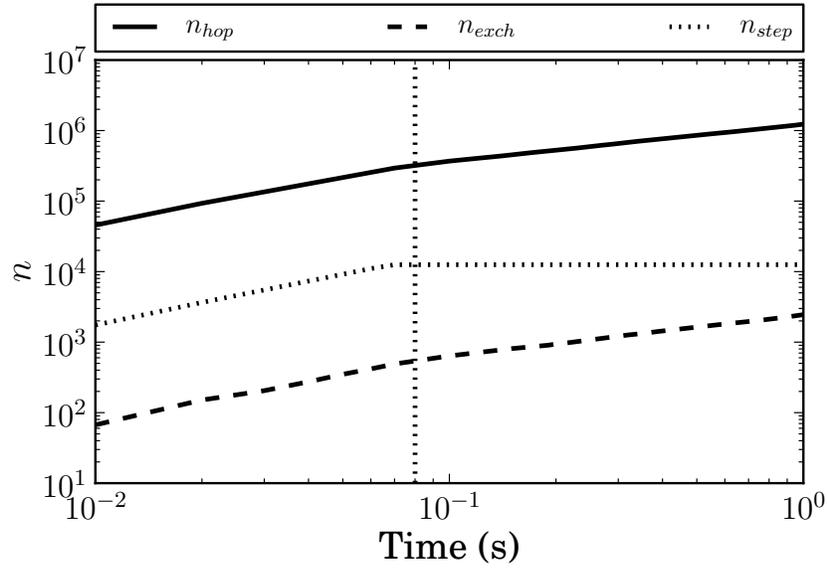
4.2.1 Kinetics of Diffusion Events

Figure 4.4 shows the cumulative number of diffusion moves for each diffusion mechanism versus time for the first 1 s of simulation time for two different current densities (-1000 A m^{-2} and -100 A m^{-2}). In both simulations, all diffusion mechanisms are active during the electrodeposition phase. Following the cessation of deposition (denoted with

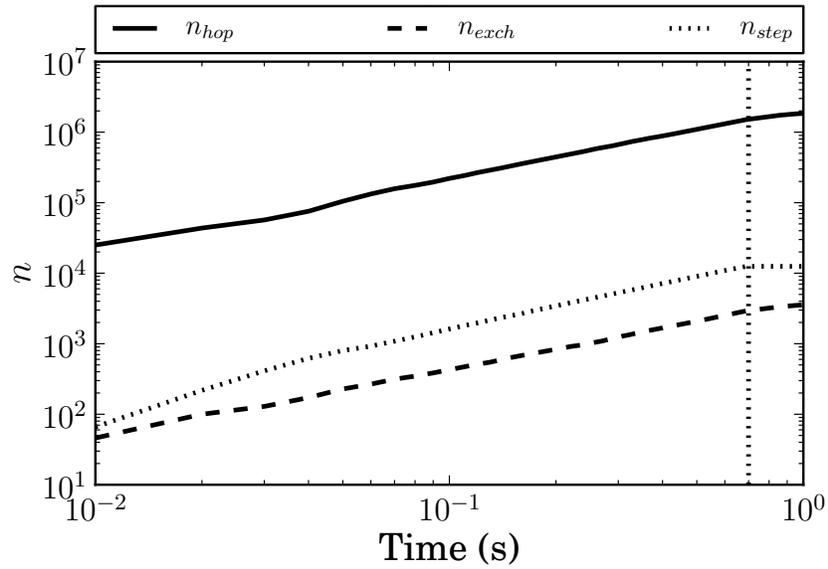
the vertical line in Figure 4.4), the step-edge atom exchange diffusion (Figure 4.1c) ceases in both simulations while both the hopping (Figure 4.1a) and atom exchange (Figure 4.1b) surface diffusion mechanisms persist. During both the initial electrodeposition and relaxation regimes, diffusion events are observed to have a power law relationship with respect to time as indicated by the linear trends in Figures 4.4a-b. This implies that growth of the deposit surface occurs in a self-similar way where deposit morphology remains qualitatively unchanged as film thickness increases. Following deposition growth, the step-edge atom exchange ceases which indicates that only hopping and atom exchange diffusion mechanisms are important in the relaxation regime.

The hopping surface diffusion mechanism is found to be dominant both in the growth and equilibrium regimes. Any adatom can undergo hopping on the surface, while only atoms that satisfy the restrictions outlined in Section 4.1.1 can undergo atom exchange and step-edge atom exchange. Given that restrictions exist on the sites where atom exchange and step-edge atom exchange surface diffusion can occur, the observation that hopping is the most frequent event is expected.

The step-edge atom exchange is found to occur only during the growth regime, which is reasonable given that the mechanism results in a new configuration that precludes the possibility of the event happening again in that locality with the atoms undergoing the exchange. Given the conditions for the mechanism (Figure 4.1), diffusion via this mechanism ceases when deposition has stopped because no additional step-edges are being created. The duration of time during which the step-edge atom exchange mechanism is most active depends on the current density which determines the rate of deposition. As the deposition rate is increased, the interval over which the step-edge exchange mechanism is most active decreases. This is supported by the increase in the rate of change in n_{step} during the deposition stage at a current density of -1000 A m^{-2} versus that at -100 A m^{-2} (Figure 4.4). Alternatively, the maximum value of n_{step} is independent of deposition rate, comparing Figures 4.4a and 4.4b. Instead, the value of n_{step} at any time is related primarily to the total number of atoms deposited up to that point.



(a)



(b)

Figure 4.4: Number of diffusion events (n) over time at a) 300 K and -1000 A m^{-2} and b) 300 K and -100 A m^{-2} . Vertical line denotes end of deposition.

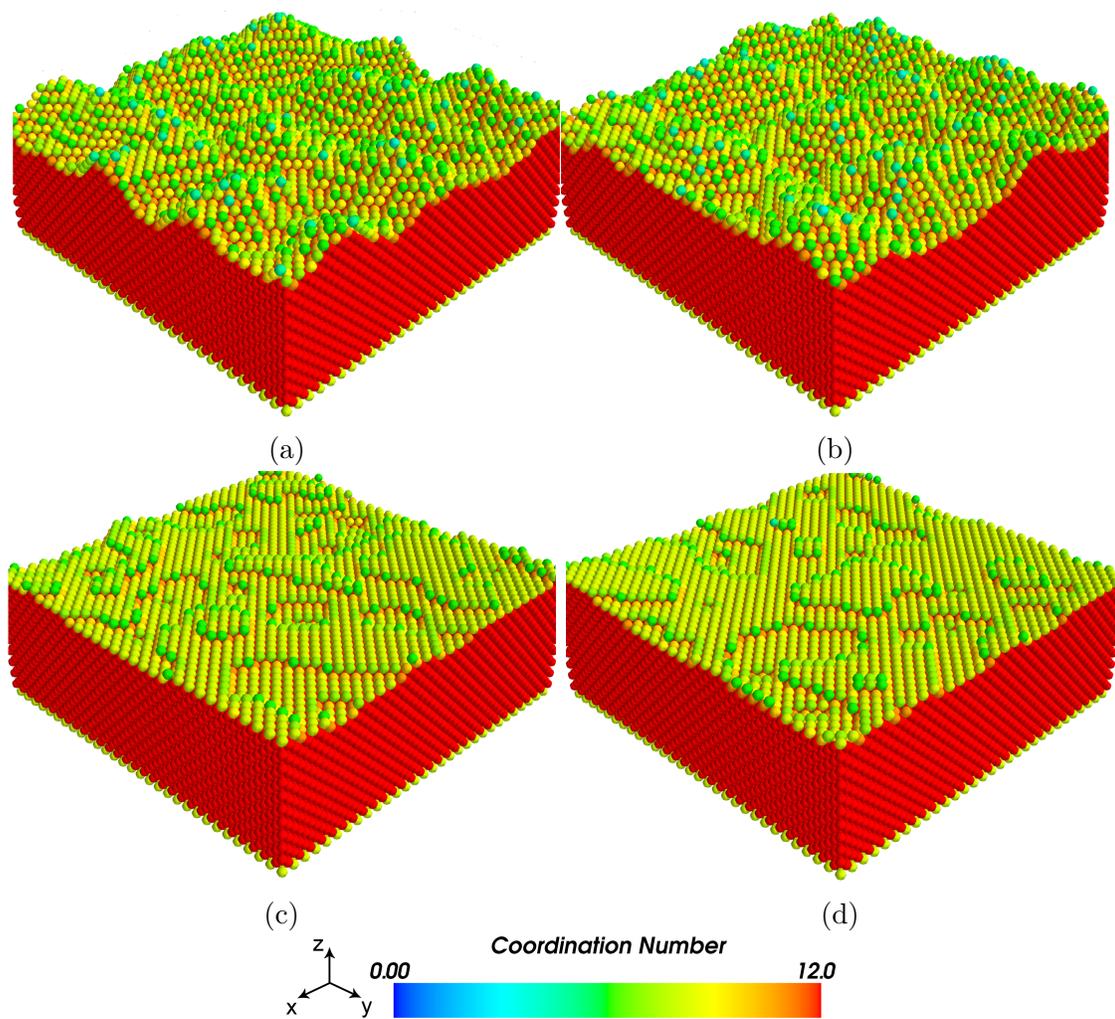


Figure 4.5: Equilibrium morphology at $t = 5$ s of simulations with a) hopping as the only diffusion mechanism deposited at -1000 A m^{-2} , b) hopping as the only diffusion mechanism deposited at -100 A m^{-2} , c) all 3 diffusion mechanisms deposited at -1000 A m^{-2} and d) all 3 diffusion mechanisms deposited at -100 A m^{-2} . Operating temperature is 300 K. Colours denote coordination number (blue to red in ascending order). The surface area of the substrates are $30a_{Cu} \times 30a_{Cu}$ ($\approx 120 \text{ nm}^2$).

4.2.2 Effect of Diffusion Mechanisms

In order to study the role of the surface diffusion mechanisms considered in KMC-EAM (Figure 4.1) on deposit morphology, two sets of simulations were performed assuming that i) hopping alone and ii) all three modes operate. Past KMC simulation studies typically include only the hopping mechanism [23, 25, 34, 36, 76]. Restricting surface diffusion to only hopping precludes the possibility of adatoms diffusing from terraces in the deposit. KMC-EAM simulations were carried out under these two conditions at current densities of -100 A m^{-2} and -1000 A m^{-2} . Equilibrium deposit configurations are shown in Figure 4.5 and a distinct difference in deposit morphology is observed independent of current density.

Deposit morphologies predicted by KMC-EAM simulations with hopping-only show a significant increase in roughness and cluster mean curvature. Deposits simulated when all three diffusion mechanisms are included are less rough and distinct terraces are formed that are large compared to the previous case. The root-mean-squared surface roughness (\overline{R}_{RMS}) is calculated using [91]:

$$R_{RMS} = \sqrt{\frac{1}{n} \sum_{i=1}^n (h_i - \bar{h})^2}, \quad (4.7)$$

where h_i is the height of each surface atom, \bar{h} is the average height, and n is the number of surface atoms. As shown in Table 4.3, the average R_{RMS} of the deposit when only hopping operates is significantly greater than when all surface diffusion modes are considered regardless of the current density. The relative difference between the two cases is significant since the absolute difference in the roughness will only increase as more layers are being deposited. The fact that the roughness of deposits formed when hopping is the only diffusion mechanism is twice that of when all three diffusion mechanisms are taken into account is an indicator of how the roughness will vary if more sites are to be deposited.

In addition to surface roughness, the morphology of the deposit surface was quantified using the Minkowski measures [92]. Three Minkowski measures are defined for a two-dimensional surface: surface area, perimeter and Euler characteristic. The Euler char-

Table 4.3: Average deposit cluster properties from Figure 4.5 – root-mean-squared roughness (\overline{R}_{RMS}), cluster area fraction (\overline{A}), average cluster perimeter (\overline{P}) and Euler characteristic ($\overline{\chi}$).

i_{dep} (A m ⁻²)	Diffusion Mechanisms	\overline{R}_{RMS} (nm)	\overline{A}	\overline{P} (nm)	$\overline{\chi}$ (nm ⁻¹)
-1000	Hopping	0.279 ± 0.004	0.14 ± 0.00	8.4 ± 0.3	1651.2 ± 17.4
	All	0.156 ± 0.004	0.74 ± 0.00	101.6 ± 43.7	1620.8 ± 21.7
-100	Hopping	0.287 ± 0.000	0.16 ± 0.00	9.8 ± 0.7	1607.7 ± 34.8
	All	0.138 ± 0.004	0.80 ± 0.02	100.1 ± 29.3	1525.2 ± 265.1

acteristic is an integral measure of curvature over the cluster boundary. To compute these morphological measures from a given deposit surface, they are converted to binary images using surface depth as image intensity. Thus these morphological measures characterize the cluster morphology of the deposit.

Table 4.3 shows the morphological measures from the two sets of simulations. The average cluster area fraction (\overline{A}) is the average fraction of the total cluster surface area relative to the total surface area. The average cluster perimeter (\overline{P}) is the average perimeter of the clusters in the domain. The average Euler characteristic ($\overline{\chi}$) is related to the total curvature of the cluster boundaries within the simulation domain.

At -1000 A m⁻², the average cluster perimeter is lower when only hopping is involved than when three diffusion mechanisms are involved. This corresponds to smaller clusters which is supported by a reduction in the average total cluster area. Since step-edge atom exchange and atom exchange which tend to level the surface and coalesce the clusters do no occur, this result is expected. The measures obtained for deposition at -100 A m⁻² are consistent with those obtained at the higher current. When the three diffusion mechanisms are considered, \overline{A} is an order of magnitude greater than that obtained when only hopping is considered.

The average perimeters for the two cases also agree with this trend by indicating smaller clusters when hopping is the only diffusion mechanism. The Euler characteristic and thus average curvature of the domains are similar, indicating that the curvature of the cluster

boundaries is determined by minimization of the cluster/bulk interfacial energy and not specific diffusion mechanisms.

The deposit surface features support the qualitative observation made based on Figure 4.5. When hopping is the only diffusion mechanism, the deposit has greater roughness and the individual clusters are smaller. The growth mode observed when three surface diffusion mechanisms are included is similar to that of Cu/Cu(100) homoepitaxial growth observed experimentally [93, 94].

4.2.3 Comparison of Equilibrium Deposits

The final set of simulations was performed over a range of initial conditions, current densities and temperatures using KMC-EAM. Equilibrium deposit configurations from these KMC-EAM simulations were then used as initial conditions for MD-EAM simulations under commensurate conditions (temperature and ensemble). Through relaxation of the approximations required to perform KMC, the MD-EAM simulations results were used to determine the validity of the equilibrium structure predicted by the KMC-EAM method for simulations of the electrodeposition process. In all KMC-EAM simulations, the occupancy fraction f_s is set to be 1.0, corresponding to electrodeposition on an atomically smooth copper crystal.

Figure 4.6 shows the difference δ_E between the mean energy of the equilibrium deposit configurations from KMC-EAM and the potential energy component of the same relaxed configurations from MD-EAM. The simulation results span current densities ranging from -10 to -1000 A m⁻² at 300 K. It is observed that δ_E is non-negligible but reasonable over the full range of applied current densities. The increase of δ_E with respect to current density is expected in that an increased deposition rate results in the formation of vacancies which result in lattice relaxations that are not considered in KMC-EAM. Furthermore, lattice relaxation at the deposit surface is also not considered, which contributes to δ_E .

The difference in atom coordination number δ_C was also determined in order to compare the KMC-EAM equilibrium configurations to those of MD-EAM. These plots are not shown

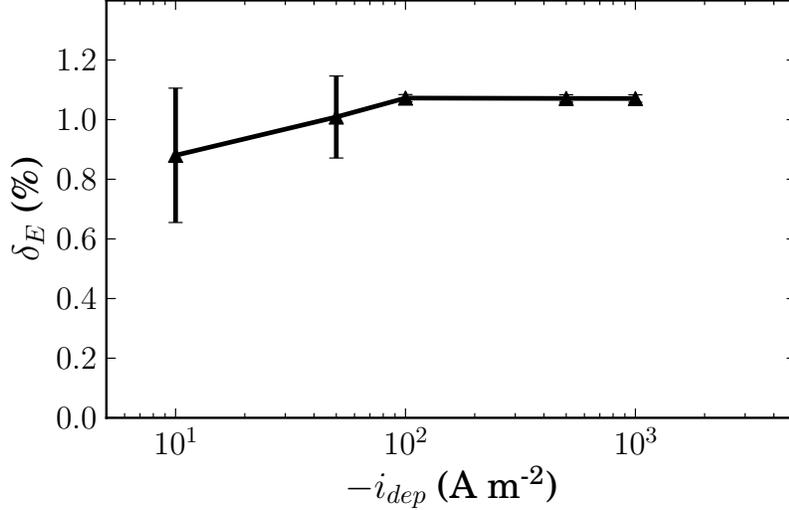


Figure 4.6: Effect of current density on δ_E obtained by MD-EAM and KMC-EAM simulations at 300 K, $h_s = 1.1$ nm and $f_s = 1.0$.

since the values of δ_C were all negligible, less than 0.04%. This implies that deposit morphology from KMC-EAM is almost identical to the average morphology from MD-EAM. Furthermore, current density was not found to have a statistically significant effect on δ_C . Thus, the difference in energy δ_E is primarily a consequence of the on-lattice approximation of KMC-EAM and not to any significant difference in the deposit morphology.

Figure 4.7 shows the difference in energy δ_E between KMC-EAM and MD-EAM equilibrium deposit configurations for applied current density of -10 A m^{-2} over a range of temperatures 300 – 330 K. A similar magnitude and trend of δ_E is observed as in the previous case with δ_E being non-negligible (ideally, $\delta_E \approx 0$) but small over the full range of operating temperatures. The values of δ_C are again negligible and thus not shown. The results can be interpreted in the same way as before, but now increasing temperature results in the increased formation of vacancies and also increased lattice strain in the MD simulations. The trend is slightly steeper than that observed from the increase of current density, which implies that the KMC-EAM method will monotonically decrease in accuracy as temperature is increased. Since the range of operating temperatures used in this work

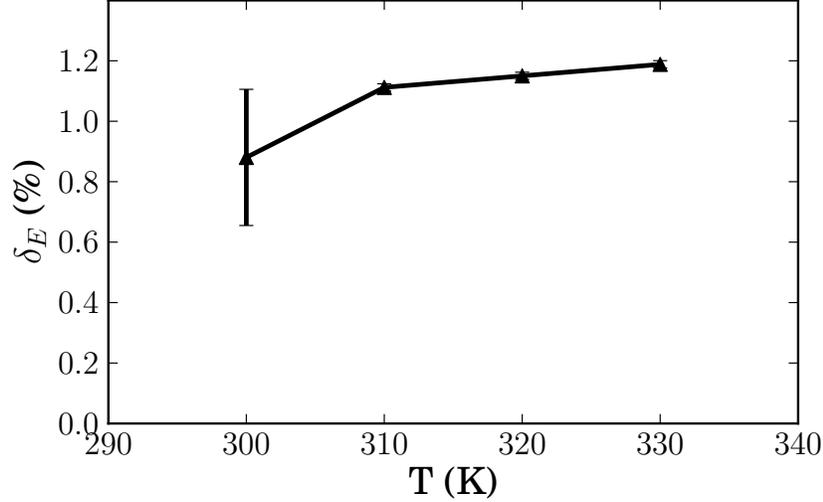


Figure 4.7: Effect of temperature on δ_E obtained by MD-EAM and KMC-EAM simulations at -10 A m^{-2} , $h_s = 1.1 \text{ nm}$ and $f_s = 1.0$.

is typical for electrodeposition processes, KMC-EAM performs adequately in comparison to MD-EAM within this range.

The final metric used to evaluate the deposit configuration predicted by KMC-EAM is the RMS displacement of atoms from their starting positions obtained from the metastable configuration of KMC-EAM to reach their final positions as computed by MD-EAM. The RMS displacement value for equilibrium single crystal copper deposits is reported to be 0.0113 nm at 300 K [95]. The RMS displacement values for the KMC-EAM simulations with current density varied at 300 K was found to range between $0.019 - 0.021 \text{ nm}$. For the set of simulations in which temperature was varied, the RMS displacement values range between $0.019 - 0.023 \text{ nm}$. These results indicate that the equilibrium configuration predicted by KMC-EAM simulations is essentially equivalent to that of MD-EAM. Furthermore, the RMS displacement values appear to be only slightly affected by the operating conditions, which supports the interpretation of δ_E and δ_C trends discussed previously.

4.3 Conclusions

A kinetic Monte Carlo methodology which uses the embedded-atom method potential and includes collective diffusion mechanisms (KMC-EAM) for single crystal systems has been developed. This methodology was applied to the simulation of galvanostatic electrodeposition of metals onto a single crystal substrate of the same species. The average energy per atom and coordination number of equilibrium configurations from KMC-EAM were validated using MD simulation. KMC-EAM was found to be accurate for deposition current density and temperature values relevant to experimental conditions. Furthermore, the KMC-EAM accurately describes the nanoscale structure of the metal deposit through direct representation of the constituent atoms, unlike the SOS and SBS methods.

In addition to analysis of equilibrium configurations, the effects of surface diffusion mechanisms (hopping, atom exchange and step-edge exchange) and diffusion kinetics were also studied. Results show that the inclusion of collective diffusion mechanisms (atom exchange and step-edge exchange), in addition to nearest neighbour hopping, were required to predict deposit configurations in agreement with both MD-EAM simulations and experimental results for Cu/Cu(100) homoepitaxy. The inclusion of the three surface diffusion mechanisms resulted in quantitatively smoother deposits, as reflected by surface morphology measures – roughness, cluster perimeter and cluster area.

The diffusion kinetics observed indicated that the step-edge exchange mechanism was active predominantly during the deposition process, while hopping and atom-exchange continued following the cessation of electrodeposition. In summary, the presented KMC-EAM method is shown to provide an accurate representation of the electrodeposition process over experimentally relevant length (microns) and time (seconds) scales.

Chapter 5

KMC-EAM Simulations of Electrodeposition onto a Polycrystalline Substrate

In the previous chapter, the KMC-EAM method was developed for single crystal systems. This chapter extends the KMC-EAM method to polycrystalline systems and applies it to three-dimensional electrodeposition of copper onto a smooth polished polycrystalline substrate. In addition to the polycrystalline deposition, the potential dependence of deposition is also included in the simulations. Simulations are performed over a range of overpotentials to predict the effect on deposit texture evolution. Results from the simulations are compared to experimental observations and known surface energies of different grain orientations of copper.

5.1 Electrochemical Kinetics

In this study, the KMC-EAM method is extended to polycrystalline electrodeposition and applied to study potentiostatic deposition. As was the case in the previous chapter, metal

deposition is assumed to proceed by a one-step reaction. Thus, the reduction of copper ions ($Cu_{(aq)}^{2+}$) to form copper atoms ($Cu_{(s)}^0$) occurs as follows:



The rate of deposition is controlled by the applied current through Faraday's law of electrolysis [49]. In the case of potentiostatic electrodeposition, the applied current depends on the applied potential. The current-potential relationship used in this study is based on the Butler-Volmer equation used by Cabán and Chapman [50] assuming that electrodeposition is kinetically controlled and the plating bath concentration is 1 mol dm^{-3} :

$$i_{Cu} = i_{Cu}^0 \left[\exp\left(\frac{\alpha_a \eta}{k_B T}\right) - \exp\left(\frac{-\alpha_c \eta}{k_B T}\right) \right] \quad (5.2)$$

where the parameters were previously described in Section 2.1. In terms of the deposition partial current density (i_{dep}) and dissolution partial current density (i_{diss}), Eqn (5.2) can be rewritten as:

$$i_{Cu} = i_{diss} + i_{dep}, \quad (5.3)$$

where:

$$i_{diss} = i_{Cu}^0 \exp\left(\frac{\alpha_a \eta}{k_B T}\right), \quad (5.4)$$

$$i_{dep} = -i_{Cu}^0 \exp\left(\frac{-\alpha_c \eta}{k_B T}\right). \quad (5.5)$$

Eqns (5.4) and (5.5) are the basis for the propensity functions of electrochemical kinetics in KMC-EAM.

5.2 Methodology

5.2.1 Processes

Four main dynamic processes are considered for copper electrodeposition: i) reduction of copper ions and deposition onto the substrate surface, ii) oxidation of copper atoms and dissolution into the electroplating bath, iii) diffusion of adatoms on the surface within a single grain and iv) diffusion of atoms along the grain boundaries. Aside from grain boundary diffusion (i.e. diffusion along a grain boundary), which has been observed at near ambient temperatures [66], diffusion within the bulk of the copper deposit is neglected since the operating conditions are in the range where few vacancies are formed [85]. Grain boundary migration (i.e. diffusion across a grain boundary) in the bulk is also assumed negligible at the operating temperatures considered here, which is supported by past work [96]. This restriction is not applied to adatoms, which are allowed to diffuse between grains.

The three surface diffusion mechanisms – hopping, atom exchange and step-edge atom exchange – are described in detail in Section 4.1.1. In addition to the assumptions made in Chapter 4, the activation energies of the events are also assumed to be constant regardless of the grain orientation. Grain boundary diffusion follows the same Arrhenius relationship as other diffusion mechanisms [97]. The activation energy for grain boundary diffusion (Table 5.2) is assumed to be 0.5 eV regardless of the type of grain boundary. This value is based on results obtained from simulation studies in ref. [97].

The propensity functions of each diffusion event are given in Table 5.1 [72] with the parameters given in Table 5.2. The assumptions made regarding the surface area used in the calculation of n_{dep} in Chapter 4 also applies to n_{diss} . Eqns (5.6) and (5.7) are obtained from the relationship between current density and frequency given in ref. [51]. The current density of deposition and dissolution are defined in Eqns (5.6) and (5.7), respectively. Parameters for the Butler-Volmer equation applicable when the electroplating bath concentration is 1 mol dm^{-3} are given in Table 5.3 [50].

Table 5.1: Propensity functions for the possible events

Mechanism	Propensity Function
Deposition	$\Gamma_{i,dep} = \frac{i_{dep}}{-zen_{dep}}$ (5.6)
Dissolution	$\Gamma_{i,diss} = \frac{i_{diss}}{zen_{diss}}$ (5.7)
Hopping	$\Gamma_{i,hop} = \begin{cases} \nu_d \exp\left(-\frac{E_{hop}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{hop} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$ (5.8)
Atom exchange	$\Gamma_{i,exch} = \begin{cases} \nu_d \exp\left(-\frac{E_{exch}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{exch} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$ (5.9)
Step-edge atom exchange	$\Gamma_{i,step} = \begin{cases} \nu_d \exp\left(-\frac{E_{step}}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_{step} + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$ (5.10)
Grain boundary diffusion	$\Gamma_{i,b} = \begin{cases} \nu_d \exp\left(-\frac{E_b}{k_B T}\right) & \Delta E \leq 0 \\ \nu_d \exp\left(-\frac{E_b + \Delta E}{k_B T}\right) & \Delta E > 0 \end{cases}$ (5.11)

Table 5.2: Parameters used in propensity functions for KMC-EAM.

Parameter	Definition	Value
n_{dep}	number of possible deposition sites per unit area	varies [=] sites m^{-2}
n_{diss}	number of possible dissolution sites per unit area	varies [=] sites m^{-2}
e	elementary charge	1.602×10^{-19} C
z	number of electrons transferred in reduction reaction	2
ν_d	atomic vibrational frequency	2×10^{13} s^{-1}
E_{hop}	hopping activation energy	0.5 eV [43]
E_{exch}	atom exchange activation energy	0.7 eV [43]
E_{step}	step-edge atom exchange activation energy	0.2 eV [43]
E_b	grain boundary diffusion activation energy	0.5 eV [97]

Table 5.3: Parameters used in Eqns (5.5) and (5.4) [50].

Parameter	Value
i_{Cu}^0	107.75 A m ⁻²
α_a	1.08
α_c	0.39

5.2.2 Propensity Scaling

In this study, the surface energies may vary between grains since the substrate is polycrystalline. Subsequently, the propensities of deposition and dissolution are not uniform across the surface. To account for the difference in surface energy of the different grain orientations of copper, an energy contribution term ($\Delta E/E_{sub}$) is applied to the propensity of deposition:

$$\Gamma'_{i,dep} = \Gamma_{i,dep} \frac{\Delta E}{E_{sub}}, \quad (5.12)$$

where ΔE is the change in energy of site i after the site becomes occupied and E_{sub} is the sublimation energy of copper ($E_{sub,Cu} = -3.54$ eV [41]). Sites with lower surface energies have higher ΔE values and thus will preferentially undergo deposition. However, this energy contribution will alter the average propensity and thus the deposition partial current density. A scaling factor is applied to $\Gamma'_{i,dep}$ at every site at which deposition can occur. Equation (5.12) becomes:

$$\Gamma'_{i,dep} = \Gamma_{i,dep} \frac{\Delta E}{E_{sub}} s_{dep}, \quad (5.13)$$

where s_{dep} is the scaling factor which is initially set to 1. The scaling factor is calculated by making use of the average of the deposition propensities:

$$\overline{\Gamma}_{dep} = \frac{1}{n_{dep}A} \sum_i \Gamma'_{i,dep}, \quad (5.14)$$

where A is the surface area (m^2). Thus,

$$s_{dep} = \frac{\overline{\Gamma}_{dep}}{\Gamma_{i,dep}}. \quad (5.15)$$

Previously computed propensities are also updated, but by a factor of $s_{dep}/s_{dep,old}$, where s_{old} is the scaling factor from the previous update, bringing the average propensity to $\Gamma_{i,dep}$.

In the case of dissolution, the energy contribution is taken into account in a slightly different manner from deposition:

$$\Gamma'_{i,diss} = \Gamma_{i,diss} \frac{E_{sub}}{-\Delta E}. \quad (5.16)$$

The difference stems from the fact that higher energy sites are more likely to be removed than lower energy sites. Higher energy sites will result in lower $|\Delta E|$ values and thus higher $E_{sub}/-\Delta E$. The negative sign in front of ΔE is due to the value of ΔE being positive in dissolution processes. The scaling factor is determined based on the same procedure as deposition, but now by making use of $\Gamma'_{i,diss}$ and n_{diss} (defined in Table 5.2):

$$\overline{\Gamma}_{diss} = \frac{1}{n_{diss}A} \sum_i \Gamma'_{i,diss}. \quad (5.17)$$

5.2.3 Representation of a Polycrystalline System

The KMC-EAM method is extended to represent polycrystalline systems for this study. Information on the number of crystal orientations in the simulation and details about the orientation are now required by the KMC-EAM method. A set of reference coordinates is generated based on the (100) crystal orientation of the metal. The reference coordinates will form the basis on which the coordinates in each orientation are based. The grain orientation is related to a rotation matrix and a translation vector as follows:

$$\mathbf{x}'_i = \mathbf{R}\mathbf{x}_i + \mathbf{t}, \quad (5.18)$$

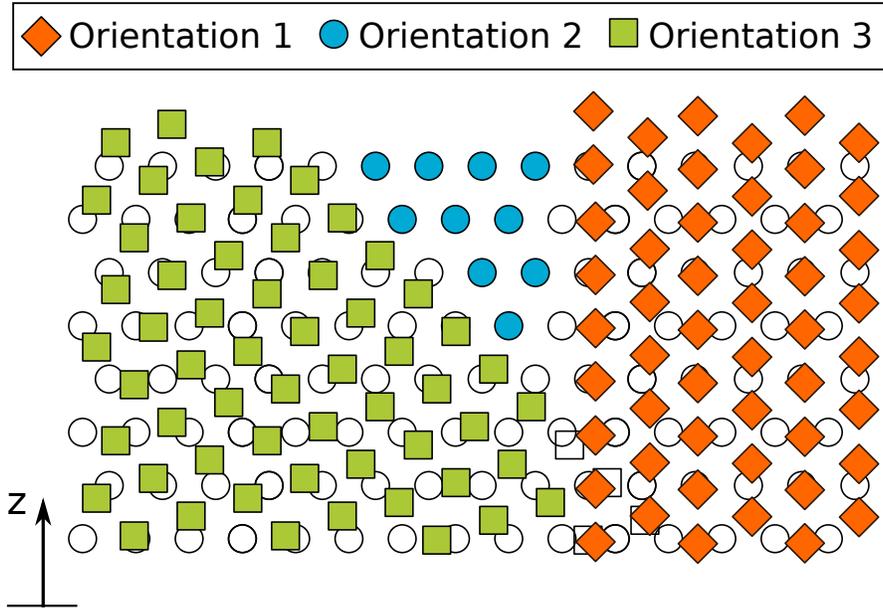


Figure 5.1: Representation of a polycrystalline system in KMC-EAM. Sites that are colored are occupied sites. Occupied sites are not allowed to overlap with occupied sites from another orientation.

where \mathbf{x}'_i is a 3×1 vector representing the new coordinates of site i , \mathbf{R} is a 3×3 rotation matrix, \mathbf{x}_i is a 3×1 vector of reference coordinates for site i and \mathbf{t} is a 3×1 translation vector. Coordinates are rotated to provide the desired orientation normal to the z direction (i.e. the direction exposed to the electroplating solution at $t = 0$) and translated so that the majority of the sites remain in the simulation domain. Any sites that are outside of the simulation domain after translation and rotation are removed but remain in the reference coordinates matrix. While the sites can overlap with each other, occupied sites cannot. Vacant sites with a neighbour from a different orientation in the $a\sqrt{2}/2$ radius that is occupied are excluded from the list of possible deposition sites. Figure 5.1 shows the representation of the sites in the KMC-EAM method.

A list of active sites in each grain is maintained to track the size of each grain. This list consists of sites with coordination numbers between 1 and 11, i.e. sites that are not

completely part of the bulk. When an active site reaches the edge of the generated grain, the grain will grow on the face at which the active site is located. The growth will double the size of the grain in that particular direction. Sites outside the simulation domain are removed from the simulation.

5.2.4 Substrate Generation

In the simulations, copper atoms deposit onto a polycrystalline copper substrate. This polycrystalline substrate is randomly generated by KMC-EAM based on a specified number of possible grain orientations (L) and a specified seed layer height (h_s). The substrate generation procedure is as follows:

1. The L possible grain orientations are defined such that they span the entire $x - y$ plane up to at least h_s .
2. Two seed sites are randomly placed in each of the L grain orientations in the $z = 0$ plane.
3. The first nearest neighbours of the seed sites are allowed to ‘grow’ (become occupied).
4. The nearest neighbours of the newly occupied sites are then allowed to grow until the grain comes into contact with another grain, as overlap with other grains is not allowed. This is repeated until no more sites that can become occupied in the seed layer exist.
5. The seed layer is then ‘polished’ down to $0.75h_s$. All sites above $0.75h_s$ become unoccupied. This is to imitate the effects of polishing the substrate prior to deposition in experiments.

5.2.5 Simulation Conditions

KMC-EAM simulations are carried out for a slab geometry that is periodic in the x and y directions to approximate an infinite plane. The algorithm for the polycrystalline KMC-

EAM method is illustrated in Figure 5.2. The copper substrate contains grains with (100), (110) and (111) planes normal to the z direction. The three planes are frequently found in copper [98–105] and their surface energies have been reported in literature [106, 107]. The substrate seed layer height is $h_s = 1.4$ nm. The simulation domain size used is $40a \times 40a \times 40a$ where $a_{Cu} = 0.3615$ nm is the lattice constant of copper [41, 86].

During the deposition stage of the simulation, dissolution can also occur. The propensity of dissolution is given in Eqn (5.7). Since Eqn (5.2) is based on the assumption that the electroplating bath concentration is 1 mol dm^{-3} , the highest overpotential in DC mode is $\eta = -0.15$ V in order to remain in the kinetically controlled regime (see Section 4.2 for details). The deposition overpotentials applied in this study are -0.05 V, -0.10 V and -0.15 V. The computational requirement to deposit 70000 sites onto $40a \times 40a$ surface is three days using one CPU.

5.3 Results and Discussion

Simulations using KMC-EAM are performed to model electrodeposition of a fixed number of atoms by the application of direct different overpotentials at 300 K. In this study, the simulation is stopped after all of the atoms have been deposited. The first set of results focuses on the effect of the size of the domain on the accuracy of the results. If the simulation domain is too small, there exists a finite size effect that will affect the kinetics predicted by the simulation. The size of the simulation domain should not have an effect on the kinetics of the system, thus it is important to determine the minimum domain size that is unaffected by finite size effect. Roughness evolution over time is chosen as a morphological measure to determine whether there is a finite size effect at a particular domain size. This measure is chosen because the roughness-time relationship follows a power law and the parameters in the power law are easily quantifiable. The exponent of the power law should be independent of domain size if finite size effect does not exist. The exponent in the roughness-time power law relationship obtained at different domain sizes is compared to determine the minimum domain size required. The second set of results

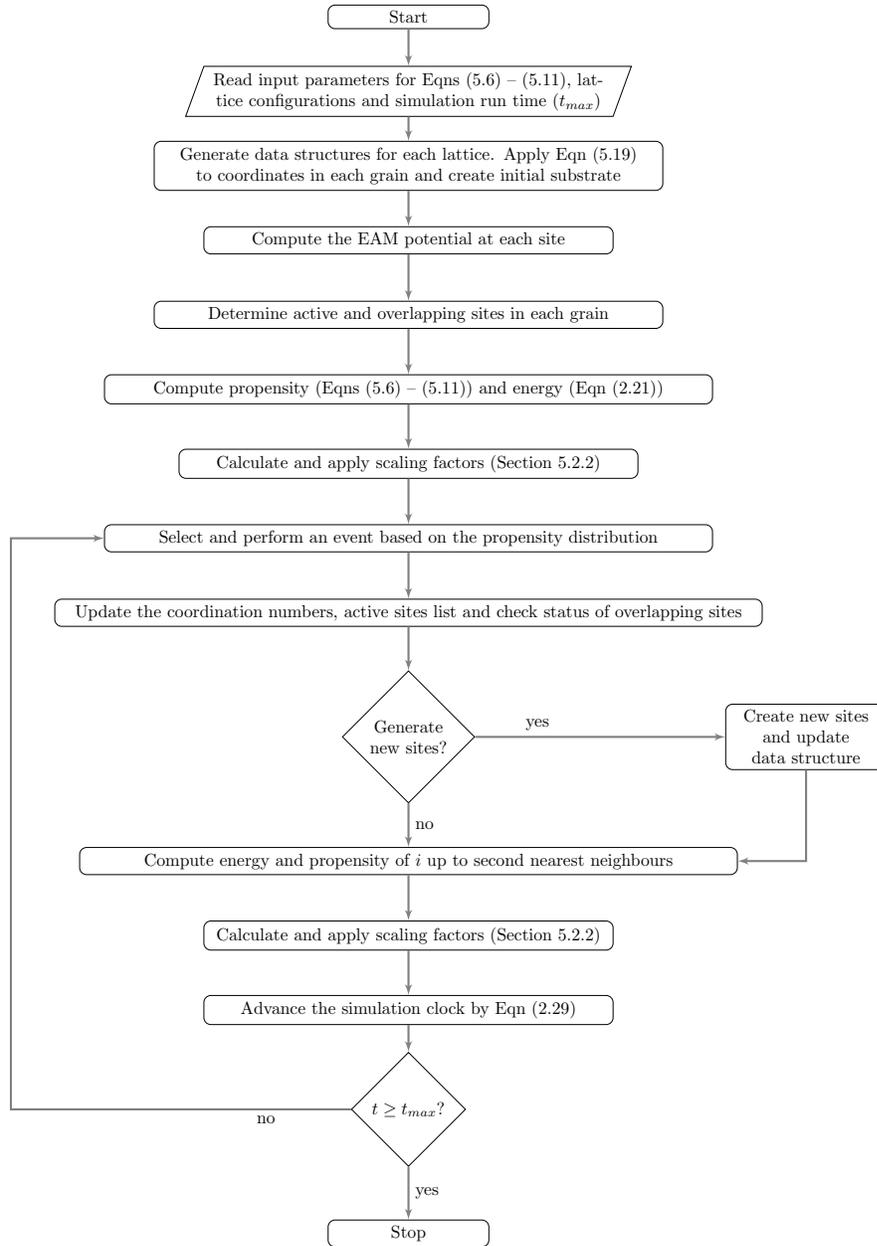


Figure 5.2: Flowchart of polycrystalline KMC-EAM algorithm

focuses on the effect of overpotential on the morphology of the deposit, specifically the roughness.

Figure 5.3 shows an example of the morphology evolution when 70000 atoms are being deposited at an overpotential of -0.15 V. In Figure 5.3a, the (100) grain have the largest surface area compared to the other two grains at the start of deposition in the randomly generated substrate (Section 5.2.4). However, as atoms are deposited, the (111) grain grows at a noticeably faster rate, covering the (100) grain to merge with the other (111) grain (Figure 5.3d). The same behaviour is observed when the 70000 atoms are being deposited at $\eta = -0.10$ V and $\eta = -0.05$ V (Figures 5.4 and 5.5, respectively). The height difference of each orientation is clear in the side view of the deposit (Figure 5.6). From the figure, the growth of the (111) plane is three-dimensional while growth of the (100) plane is two-dimensional and that of (110) is between the two extremes. This qualitative observation is in agreement with experimental results for copper homoepitaxy on (100) and (111) planes [94, 108, 109].

Figure 5.7 shows how the volume of each orientation increases with respect to its initial volume for the first 0.1 s of deposition. The grain volume (111) orientation is found to be increasing at a faster rate than the other two orientations at the three overpotentials. This supports the qualitative observation made based on the deposit morphology in Figures 5.3, 5.4 and 5.5. This behaviour stems from the differences in the surface energies of the different faces of copper [106, 107]. Since the (111) orientation has the lowest surface energy, atoms will preferentially deposit on this surface.

KMC-EAM accounts for the non-uniform deposition and dissolution propensities through differences in energy contributions (Section 5.2.2). Experimental results indicate that the (111) plane is the most dominant orientation in copper deposits [98–105]. Based on this and the result observed in Figures 5.3 – 5.7, the method discussed in Section 5.2.2 accurately captures the preferential growth of (111)-oriented grains in copper deposition. However, it is important to note that while (111) grows preferentially in all cases, the growth of the (110) and (100) planes observed experimentally appears to be dependent on both the substrate and deposition conditions.

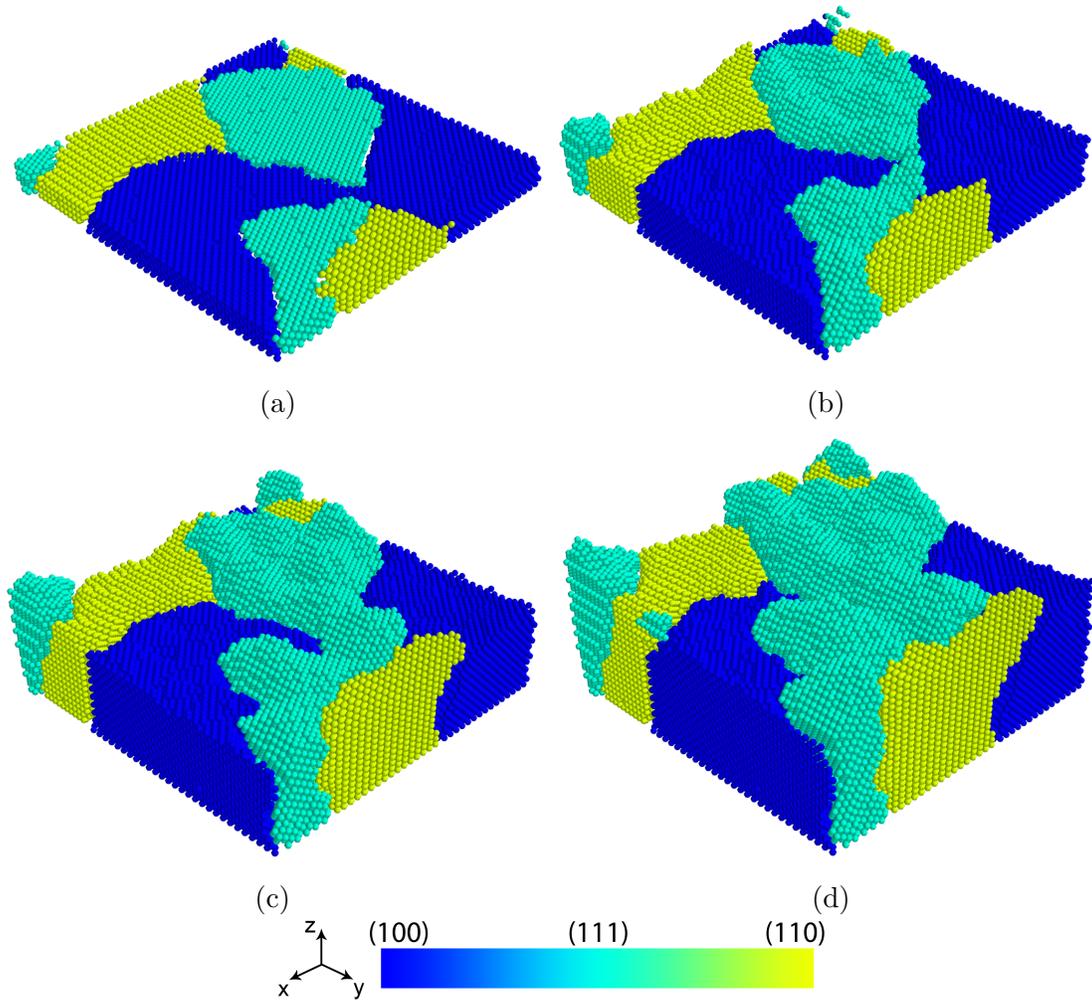


Figure 5.3: Morphology evolution when a) 0 % (the randomly generated substrate), b) 33.3 %, c) 66.7 % and d) 100 % of the 70000 atoms have been deposited at $\eta = -0.15$ V. Colours denote grain orientation. The surface area of the substrates are $40a_{Cu} \times 40a_{Cu}$ ($\approx 210 \text{ nm}^2$).

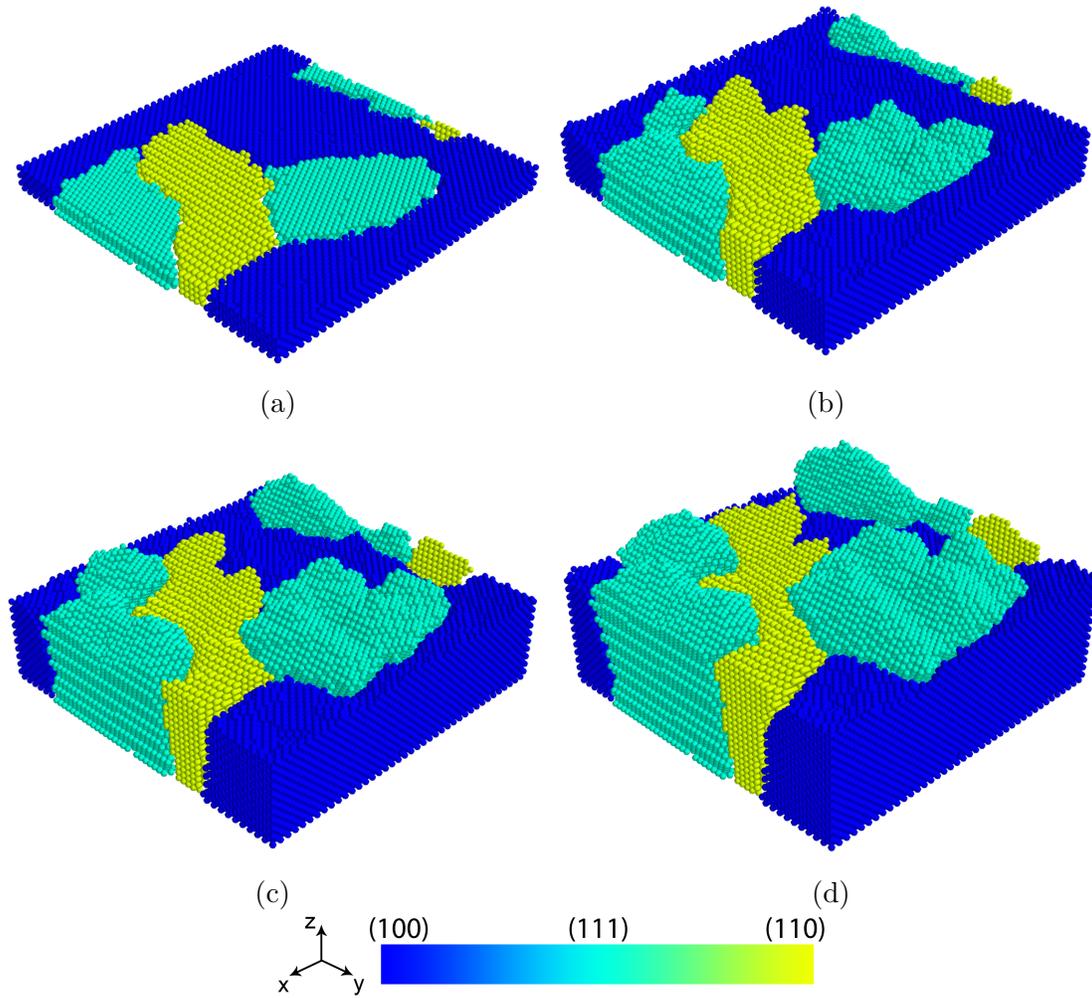


Figure 5.4: Morphology evolution when a) 0 % (the randomly generated substrate), b) 33.3 %, c) 66.7 % and d) 100 % of the 70000 atoms have been deposited at $\eta = -0.10$ V. Colours denote grain orientation. The surface area of the substrates are $40a_{Cu} \times 40a_{Cu}$ ($\approx 210 \text{ nm}^2$).

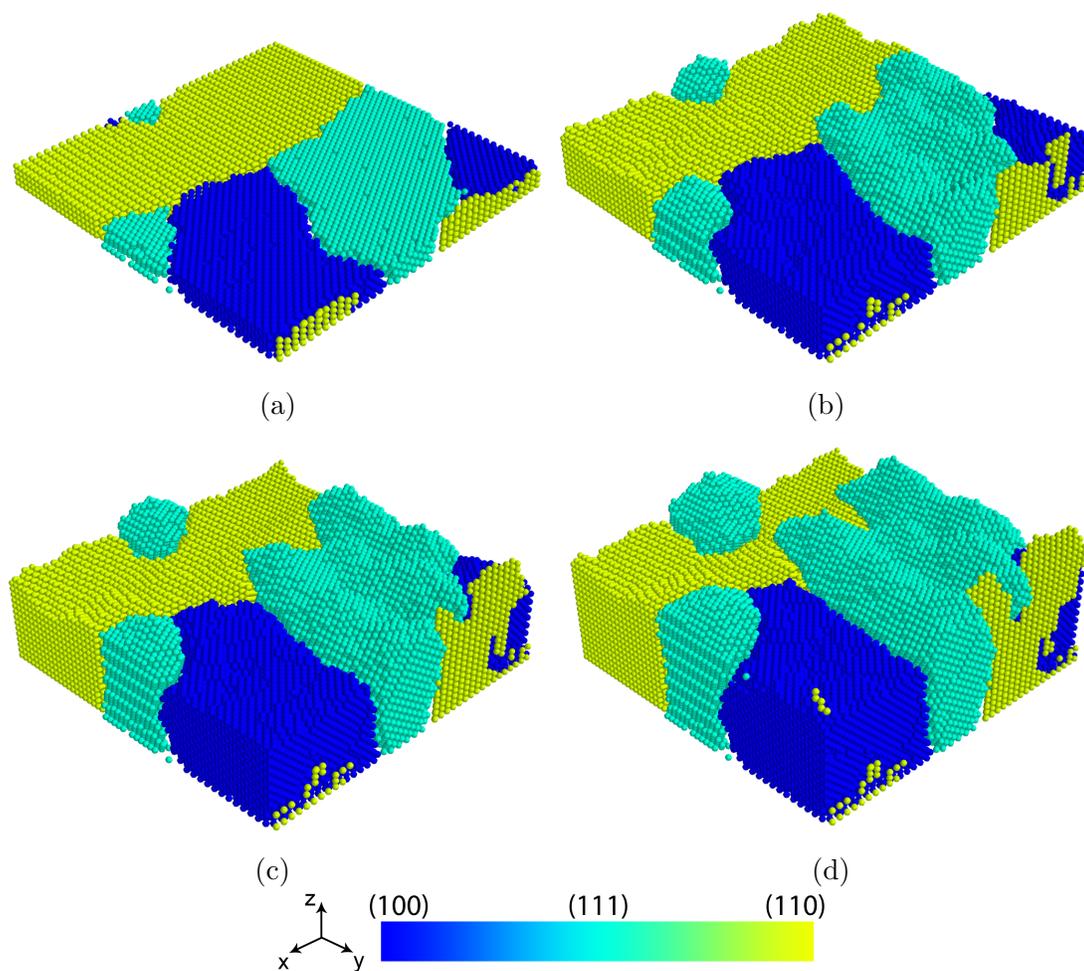


Figure 5.5: Morphology evolution when a) 0 % (the randomly generated substrate), b) 33.3 %, c) 66.7 % and d) 100 % of the 70000 atoms have been deposited at $\eta = -0.05 \text{ V}$. Colours denote grain orientation. The surface area of the substrates are $40a_{Cu} \times 40a_{Cu}$ ($\approx 210 \text{ nm}^2$).

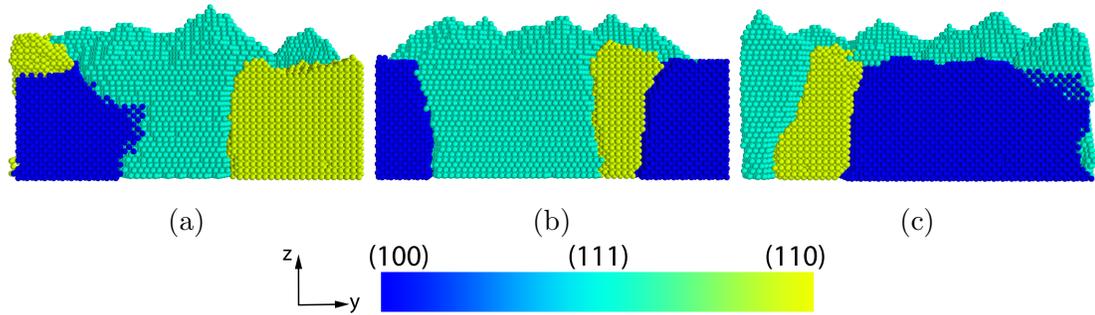
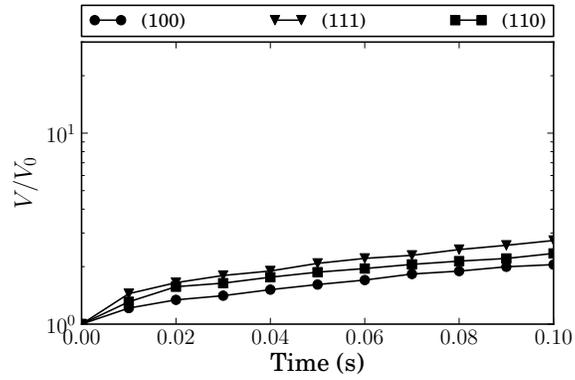


Figure 5.6: Side view of final deposit morphologies at a) $\eta = -0.05$ V, b) $\eta = -0.10$ V and c) $\eta = -0.15$ V. Colours denote grain orientation. The surface area of the substrates are $40a_{Cu} \times 40a_{Cu}$ (≈ 210 nm²).

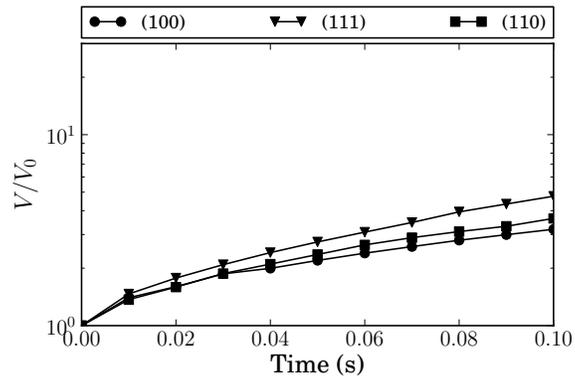
5.3.1 Effect of Domain Size

The size of the domain can have an effect on the simulation results even when periodic boundary conditions are used. If the domain size is too small, the behaviour of the system captured will be affected by the apparent proximity of grains to each other. Thus, it is important to determine the minimum domain size for which the results are not affected.

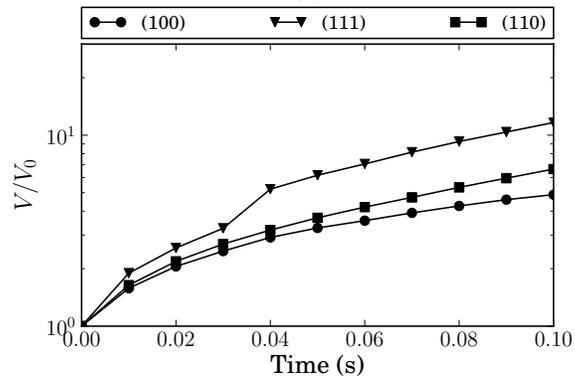
In order to determine this critical (minimum) size, simulations of varying domain sizes were performed. The domain sizes chosen are $20a_{Cu} \times 20a_{Cu} \times 40a_{Cu}$, $25a_{Cu} \times 25a_{Cu} \times 40a_{Cu}$, $30a_{Cu} \times 30a_{Cu} \times 40a_{Cu}$, $35a_{Cu} \times 35a_{Cu} \times 40a_{Cu}$ and $40a_{Cu} \times 40a_{Cu} \times 40a_{Cu}$. The parameter used to track the kinetics of the system is the evolution of surface roughness over time. Surface roughness is affected by the kinetics of the system, if the kinetics predicted by the simulation is affected by finite size effect, the roughness evolution will also be affected. At each domain size, the equivalent of 20 monolayers for that domain was deposited and the roughness evolution of the deposit over time was calculated. Depositing a fixed number of atoms for all domain sizes will result in significant variations in the morphology evolution. The equivalent of one monolayer in one domain size could be equivalent to many monolayers in another domain size, this will render the roughness-time data incomparable. The RMS roughness of the surface is calculated using Eqn (4.7). The roughness evolution is assumed



(a)



(b)



(c)

Figure 5.7: Grain volume/(initial volume) of the (100), (111) and (110) orientations with time at a) $\eta = -0.05$ V, b) $\eta = -0.10$ V and c) $\eta = -0.15$ V.

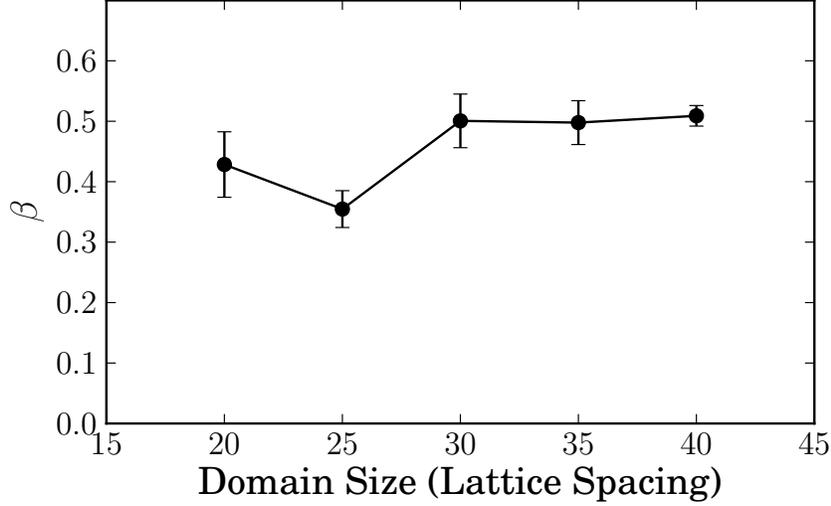


Figure 5.8: Variation of average roughness exponent with domain size. Error bars denote standard deviation.

to follow a power law relationship with time:

$$R_{RMS} = Ct^\beta, \quad (5.19)$$

$$\log R_{RMS} = \log C + \beta \log t, \quad (5.20)$$

where C is a constant and β is the power law exponent.

The average value of β obtained at each domain size is shown in Figure 5.8. Once the domain size is increased to $30a_{Cu} \times 30a_{Cu} \times 40a_{Cu}$ the roughness exponent converges to $\beta \approx 0.5$ and becomes independent of domain size. Thus, it appears that the size of the domain no longer affects the roughness of the deposit when it becomes larger than $30a_{Cu} \times 30a_{Cu} \times 40a_{Cu}$. Thus the critical domain size is $30a_{Cu} \times 30a_{Cu}$ ($\approx 120 \text{ nm}^2$) in the $x - y$ direction. The value $\beta \approx 0.5$ also agrees very well with the roughness exponents obtained from additive-free electrodeposition experiments [15, 110] and copper sputtering experiments [111] with atomic force microscopy measurements (Table 5.4). Previous atomistic simulations have failed to obtain values remotely close to those obtained experi-

Table 5.4: Comparison of β values for copper deposition

Type	Study	β	Ref.
Simulation	Polycrystalline KMC-EAM	0.58 ± 0.07	This study
	Multiscale KMC	0.04 ± 0.06	[15]
Experimental	Single Crystal Cu(111) Electrodeposition	0.51	[15]
	Cu Sputtering	0.62 ± 0.07	[111]
	Stirred Cu Electrodeposition	0.45 ± 0.05	[110]

mentally without the help of adjustment parameters [15,32].

5.3.2 Effect of Overpotential on Roughness

In this study, the overpotential is varied to determine its effect on the surface roughness. Simulations were carried out with a domain size of $40a_{Cu} \times 40a_{Cu} \times 40a_{Cu}$ and 70000 atoms being deposited. When substituted into Eqn (5.2), the overpotentials yield current densities in the range that was studied in Chapter 4. Figure 5.9 shows the variation of the average RMS roughness with overpotential. The RMS roughness appears to be unaffected by the increase in overpotential. This trend is in agreement with the results obtained for single crystal deposition (Table 4.3) where the difference between RMS roughness at -1000 A m^2 and -100 A m^2 is in the order of 10^{-2} nm .

From the results shown in Figures 5.3 – 5.5, the three orientations appear to exhibit different growth modes and the roughness of each plane varies. The (111) grain is observed to undergo three-dimensional growth, which is supported by the orientation-specific roughness measurements in Figure 5.10. The RMS roughness of the (111) grain is twice that of the (100) grain since the adatoms in the (111) grain undergo fewer step-edge atom exchange events than the adatoms in the other two orientations. The RMS roughness of the (110) grain is slightly higher than that of (100), supporting the observation from Figures 5.3 – 5.5 that the growth mode of (110) is between fully three-dimensional and two-dimensional.

While the effect of deposition rate on roughness is similar for single crystal simulations

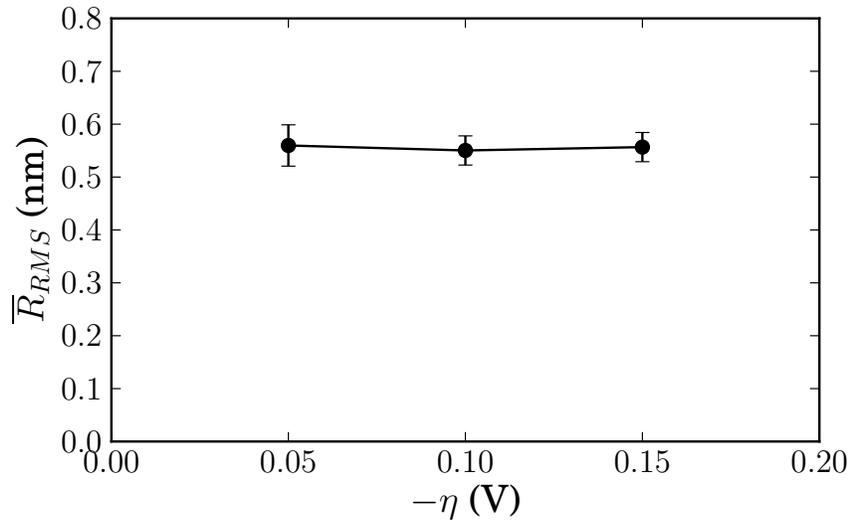


Figure 5.9: Variation of the average final roughness with overpotential. Error bars denote standard deviation.

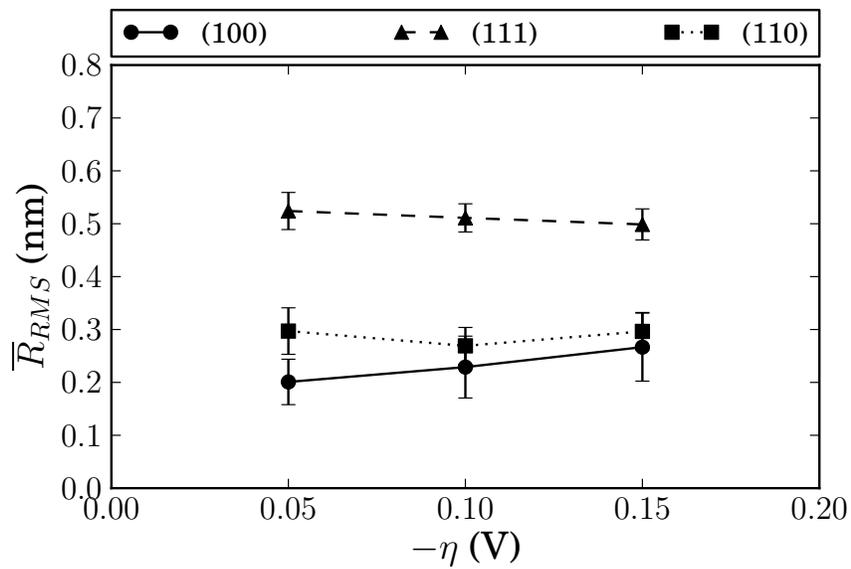


Figure 5.10: Variation of the average final roughness of each grain orientation with overpotential. Error bars denote standard deviation.

and polycrystalline simulations, the actual roughnesses are significantly different. The overall RMS roughness of polycrystalline deposits are four times that of single crystal deposits. In single crystals, no grain boundary effects that could affect the roughness of the deposit obviously occur. The grain-specific roughness of the (100) grain is higher than the roughness reported for single crystal deposition onto the same grain orientation, indicating that the presence of other grains can have an effect on the roughness of a deposit.

5.4 Conclusions

The KMC-EAM methodology has been extended to simulate potentiostatic deposition onto polycrystalline substrates in addition to the galvanostatic deposition onto single crystal substrates previously presented. The atom dissolution mechanism that exists in electrodeposition has also been incorporated into the kinetics captured by KMC-EAM. Grain boundary diffusion and surface diffusion across grains are taken into account in this novel method to describe polycrystalline-specific diffusion events. The method uses Butler-Volmer kinetics to describe the potential dependence of deposition and dissolution rates. The effect of grain orientation on deposition and dissolution kinetics are taken into account through the EAM potential. This results in preferential growth of (111) orientation in agreement with the experimental behaviour that has been previously reported. The growth modes observed are in agreement with experimental results for Cu/Cu(100) and Cu/Cu(111) homoepitaxy. In addition, KMC-EAM was found to accurately predict the exponent in the roughness-time power law relationship with respect to experimental data without the need for any adjustment parameters, which previous atomistic simulations were unable to do.

Chapter 6

Conclusions

6.1 Conclusions

In this work, a novel KMC methodology for simulating electrodeposition under both galvanostatic and potentiostatic conditions using the highly descriptive EAM potential was developed. The KMC-EAM method was found to accurately predict the kinetics of electrodeposition for both single crystal and polycrystalline systems. The polycrystalline KMC methodology is the first three-dimensional polycrystalline method that utilizes the EAM potential and supports both galvanostatic and potentiostatic deposition modes to simulate electrodeposition. The morphology of the deposits follow the same trends observed experimentally. The general conclusions of this work are:

- The KMC-EAM method accurately describes deposit morphology over experimentally relevant deposition rates and temperatures.
- Step-edge atom exchange mechanism is predominantly active during the deposition process.
- Collective diffusion events are required to accurately predict deposit morphology.

- Propensity scaling allows for surface energy to be accurately taken into account in deposition kinetics.
- Roughness-time relationship predicted by KMC-EAM is in agreement with experimental results when the domain size is larger than the critical domain size.

6.2 Recommendations

1. Several simplifications were made with respect to the kinetics of the system. It is recommended that future studies remove the following simplifications:
 - (a) *Constant surface area* – In propensity calculations of deposition and dissolution, the surface area term is assumed to be constant and is approximated to be the projected surface area of the domain in the $x - y$ plane. This assumption is valid when the deposit is smooth, which is not always the case. The surface area should be computed at every time step and based on the actual number of surface sites.
 - (b) *Activation energy* – The activation energy of each diffusion event is assumed to be constant regardless of grain orientation. In reality, this is not the case, as some diffusion events will preferentially occur in one texture over another. Different activation energies should be used based on the grain orientation.
2. The main limiting factor with KMC-EAM is the size of the domain that can be simulated in a reasonable time frame. It is recommended that the following optimization be made to the KMC-EAM method:
 - (a) *Pre-tabulating distances between sites* – The majority of computational time is spent evaluating the EAM potential. This calculation makes use of the distance between sites, which is discarded after the potential calculation is completed. Since the distance between sites does not change with time, it can be stored and would not have to be recalculated after every event.

- (b) *Identifying surface diffusion events* – The current approach in identifying surface diffusion events involves a series of *if/else* statements. Instead, an external graph library can be used to identify the configuration of the atom and thus the possible surface diffusion events that can occur.
 - (c) *Optimizing neighbour solver and neighbour update* – The current neighbour solver is a brute force solver. When the grain data structure grows, the neighbour solver recomputes the neighbour lists using a brute force algorithm. This brute force solver is extremely slow and the neighbour update can be limited to current active sites and new sites.
 - (d) *Limiting EAM potential evaluation to active sites* – Currently, the EAM potential is evaluated over all sites in the domain. This is unnecessary, as sites in the bulk will not experience any change to their potential energy.
3. While the KMC-EAM method is able to accurately predict the dynamics of electrodeposition of metal onto the same metal substrate, this condition is only one of the many possible modes of electrodeposition. The following types of simulations should also be considered:
- (a) *Coarse-grained KMC* – Coarse-grained KMC will help KMC access longer time scales and large domain sizes.
 - (b) *Multiscale simulations* – Multiscale simulations will enable access to either larger time scales through continuum equations or more detailed kinetics through smaller length scale methods such as DFT or MD. This will also allow for mass transfer effects in the adjacent electrolyte to be studied, which in turn will allow for experimentally relevant simulations of pulsed deposition to be conducted.
 - (c) *Strained heteroepitaxial growth* – Incorporation of the effect of elastic energy on deposit morphology in metal deposition onto a foreign substrate will significantly extend the applications of the KMC-EAM method.

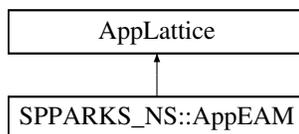
Appendix – KMC-EAM Documentation

The following documentation is generated using Doxygen².

SPPARKS_NS::AppEAM Class Reference

```
#include <app_eam.h>
```

Inheritance diagram for SPPARKS_NS::AppEAM:



Public Member Functions

- [AppEAM](#) (class SPPARKS *, int, char * *)
- virtual [~AppEAM](#) ()
- virtual void [grow_app](#) ()
- virtual void [init_app](#) ()

²URL: <http://www.stack.nl/~dimitri/doxygen/index.html>

- virtual void `setup_app` ()
- virtual void `setup_end_app` ()
- virtual double `site_energy` (int, int)
- virtual void `site_event_rejection` (int, class RandomPark *)
- virtual double `site_propensity` (int)
- virtual void `site_event` (int, class RandomPark *)
- void `stats` (char *)
- void `stats_header` (char *)

Private Member Functions

- double `system_energy` (int, int, int, int, int)
- int `neighbor_check` (int, int, int)
- int `edge_check` (int, int)
- void `coord_update` (int, int)
- void `update_dep_flag` (int)
- void `gen_seed_layer` (class RandomPark *, vec_int)
- void `update_status` (int, int, int)
- void `check_grain_distance` (int)
- void `check_grain_distance` (int, int)
- int `determine_direction` (int, int)
- double `get_local_coordinates` (array_coordinates &, int, int)
- int `exchange_destination` (int, int, int)
- void `scale_propensities` ()

Private Attributes

- int `seed_n`
- int `n_hop`
- int `n_atomexch`
- int `n_step`
- int `n_grain`
- int `n_boundary`

- `vec_int_array_2` `diff_sites`
- `vec_int` `sites`
- `double` `i_dep`
- `double` `i_diss`
- `double` `alpha_a`
- `double` `alpha_c`
- `double` `i0`
- `double` `eta`
- `double` `ox_rate`
- `int` `dep_mode`
- `int` `diss_sites_count`
- `vec_int` `diss_sites_count_grain`
- `double` `i_a_dep`
- `double` `i_a_diss`
- `double` `z_me`
- `double` `Ed`
- `double` `Ed_exch`
- `double` `Ed_step`
- `double` `Ed_grain`
- `double` `Ed_boundary`
- `double` `v_d`
- `double` `v_exch`
- `double` `v_step`
- `double` `v_grain`
- `double` `v_boundary`
- `double` `seedlayer_size`
- `double` `seed_frac`
- `double` `charge`
- `int` `n_diss`
- `int` `n_max`
- `int` `dep_sites_count`
- `vec_coordinates` `phi_old`
- `double` `old_eng`

- int `phi_old_count`
- int `count`
- vec_int `dep_sites_count_grain`
- double `max_eng`
- double `polish_height`
- vec_int `dep_sites`
- vec_int `diss_sites`
- double `scale_dep_on`
- double `scale_dep_off`
- double `scale_diss_on`
- double `scale_diss_off`
- int `pulse`
- double `on_dt`
- double `off_dt`
- double `prev_time`
- int `pulse_on`
- vec_vec_double `dep_diss_prob`
- PairEAM * `pair`

Constructor & Destructor Documentation

`AppEAM::AppEAM (class SPPARKS * spk, int narg, char ** arg)`

Constructor for [AppEAM](#) Arguments for [AppEAM](#):

1. seed layer height in Angstroms
2. fraction of number of occupied sites in seed layer
3. dep - deposition mode (p - potentiostatic; g - galvanostatic)
4. z_me - number of electrons required for metal reduction
5. n_max - max number of atoms adsorbed
6. Ed - hopping diff activation energy (eV)

7. Ed_exch - atom exchange diffusion activation energy (eV)
8. Ed_step - step edge atom exchange activation energy (eV)
9. v_d - vibrational freq of atom for hopping (1/s)
10. v_exch - vibration freq of atom for atom exchange (1/s)
11. v_step - vibration freq of atom for step edge atom exchange (1/s)
12. Ed_grain - activation energy for diffusion across grain boundaries (eV)
13. Ed_boundary - activation energy for diffusion ALONG grain boundaries (eV)
14. v_grain - vibration freq of atom for diffusion across grain boundaries (1/s)
15. v_boundary - vibration freq of atom for diffusion along grain boundaries (1/s)

If galvanostatic deposition:

1. i_dep - deposition current density (pA/nm²; 1 pA/nm² = 10⁶ A/m²)

If potentiostatic deposition:

1. eta - overpotential (V vs SHE)
2. alpha_a - transfer coefficient for anodic reaction
3. alpha_c - transfer coefficient for cathodic reaction
4. i0 - exchange current density (pA/nm²; 1 pA/nm² = 10⁶ A/m²)

Plating mode:

1. pulse - pulse-plating type (dc->0, pp->1, or pr->2)

If DC, no parameters required

If pulse-plating:

1. pulse_on - current on time

2. pulse_off - current off time

If pulse-reverse:

1. pulse_on - current on time

2. pulse_off - current off time

3. ox_rate - oxidation rate - overpotential (V)

```
00053                                     :
00054     AppLattice(spkn, narg, arg)
00055 {
00056     ninteger = 4;           // 1) site type, 2) site grain id,
00057                           // 3) coordination number, 4) deposition site indicator
00058     ndouble = 2;          // rho - embedding density, phi - site energy
00059     delpropensity = 1;
00060     delevent = 0;
00061     allow_kmc = 1;
00062     allow_rejection = 0;
00063     allow_masking = 0;
00064     numrandom = 1;
00065
00066     dt_sweep = 1;
00067
00068     seed_n = 0;
00069     count = 0;
00070
00071     pulse = 0;
00072
00073     on_dt = off_dt = prev_time = 0.;
00074
00075     i0 = 0.;
00076     eta = 0.;
00077     alpha_a = alpha_c = 0.;
00078     ox_rate = 0.;
00079     i_diss = i_dep = 0.;
00080
00081     n_hop = n_atomexch = n_step = n_grain = n_boundary = n_diss = 0;
00082
00083     scale_dep_on = 1.;
00084     scale_dep_off = 1.;
00085     scale_diss_on = 1.;
00086     scale_diss_off = 1.;
00087
00088     dep_sites_count = 0;
00089     diss_sites_count = 0;
00090
00091     charge = 1.602176565e-19; // charge of an electron (C)
00092
00093     // parse arguments
00094     if ((narg < 16) || (strcmp(name, "eam") != 0))
00095         error->all(FLERR, "Illegal app_style command");
```

```

00096
00138     seedlayer_size = atof(arg[1]);
00139     seed_frac = atof(arg[2]);
00140
00141     z_me = atof(arg[4]);
00142     n_max = atoi(arg[5]);
00143     Ed = atof(arg[6]);
00144     Ed_exch = atof(arg[7]);
00145     Ed_step = atof(arg[8]);
00146     v_d = atof(arg[9]);
00147     v_exch = atof(arg[10]);
00148     v_step = atof(arg[11]);
00149     Ed_grain = atof(arg[12]);
00150     Ed_boundary = atof(arg[13]);
00151     v_grain = atof(arg[14]);
00152     v_boundary = atof(arg[15]);
00153
00154     // set up plating conditions
00155     if (strcmp(arg[3], "p") == 0)
00156     {
00157         if (narg < 21)
00158             error->all(FLERR, "Deposition parameters not specified");
00159
00160         eta = atof(arg[16]);
00161         alpha_a = atof(arg[17]);
00162         alpha_c = atof(arg[18]);
00163         i0 = atof(arg[19]);
00164
00165         dep_mode = 1;
00166
00167         if (strcmp(arg[20], "dc") == 0)
00168         {
00169             pulse = 0;
00170             pulse_on = 1;
00171         }
00172
00173         if (strcmp(arg[20], "pp") == 0)
00174         {
00175             if (narg != 23)
00176                 error->all(FLERR, "Pulse-plating conditions required");
00177
00178             pulse = 1;
00179             pulse_on = 1;
00180             on_dt = atof(arg[21]);
00181             off_dt = atof(arg[22]);
00182         }
00183
00184         if (strcmp(arg[20], "pr") == 0)
00185         {
00186             if (narg != 24)
00187                 error->all(FLERR, "Pulse-plating conditions required");
00188
00189             pulse = 2;
00190             pulse_on = 1;
00191             on_dt = atof(arg[21]);
00192             off_dt = atof(arg[22]);
00193             ox_rate = atof(arg[23]);

```

```

00194     }
00195     }
00196     }
00197     }
00198     else if (strcmp(arg[3], "g") == 0)
00199     {
00200         if (narg < 18)
00201             error->all(FLERR, "Deposition current density not specified");
00202
00203         i_dep = atof(arg[16]);
00204
00205         dep_mode = 0;
00206
00207         if (strcmp(arg[17], "dc") == 0)
00208         {
00209             pulse = 0;
00210             pulse_on = 1;
00211         }
00212
00213         if (strcmp(arg[17], "pp") == 0)
00214         {
00215             if (narg != 20)
00216                 error->all(FLERR, "Pulse-plating conditions required");
00217
00218             pulse = 1;
00219             pulse_on = 1;
00220             on_dt = atof(arg[18]);
00221             off_dt = atof(arg[19]);
00222         }
00223
00224         if (strcmp(arg[17], "pr") == 0)
00225             error->all(FLERR, "Pulse-reverse is unsupported in galvanostatic mode");
00226     }
00227
00228     if ((seed_frac <= 0.) || (seed_frac > 1.0))
00229         error->all(FLERR, "Fraction must be between 0 and 1.");
00230
00231 }

```

AppEAM::~AppEAM () [virtual]

```

00236 {
00237 }

```

Member Function Documentation

void AppEAM::check_grain_distance (int *grain*) [private]

Checks the distance between active sites in grain and active site of other grains to see if the grains have met

Parameters

<i>grain</i>	Grain ID that needs to be checked
--------------	-----------------------------------

Checks the distance between active sites in grain and neighbors from other grains to see if the grains are in close proximity of each other. If they are, change the `dep_flag` of those sites in proximity to either -1 or -2 depending on the type. This will inhibit deposition at those sites and will help identify sites that can undergo grain boundary diffusion and grain boundary migration.

Computationally, it's faster to flip `dep_flag[i]` to -1 than to compare the energy difference if deposition is to occur at site *i*. Sites that are less than the cutoff distance away from each other would have a repulsive energy contribution to the Hamiltonian and the event would have been unlikely (as in impossible) anyway.

```
01122 {
01123     vec_int& type_i = lattice[grain]->iarray[0];
01124     vec_int& dep_flag_i = lattice[grain]->iarray[3];
01125
01126     vec_vec_int& global_neighbors = lattice[grain]->global_neighbors;
01127     vec_int& num_global_neighbors = lattice[grain]->num_global_neighbors;
01128
01129     vec_coordinates& coordinates_i = lattice[grain]->coordinates;
01130
01131     double x_i, y_i, z_i, x_j, y_j, z_j, dx, dy, dz, rsq;
01132     double cutoff = ((lattice[grain]->latconst)/1.01)*((lattice[grain]->latconst)/1.01);
01133
01134     double xmid = domain->midpoint(0);
01135     double ymid = domain->midpoint(1);
01136     double zmid = domain->midpoint(2);
01137
01138     for (int ii = 0; ii < active_sites[grain].size(); ii++)
01139     {
01140         int i = active_sites[grain][ii];
01141
01142         int flag = 0;    // flag indicating whether dep_flag needs to be reverted back from
01143
01144         x_i = coordinates_i[i][0];
01145         y_i = coordinates_i[i][1];
01146         z_i = coordinates_i[i][2];
01147
01148         // only search over global neighbors of site i to speed up the search
01149         // this is ok given the cutoff used here and in finding global neighbors
01150         for (int jj = 0; jj < num_global_neighbors[i]; jj++)
01151         {
01152             int j = global_neighbors[i][jj];
01153             pair_int j_local = global_to_grain(j);
01154
01155             // if global neighbor is in the same grain, ignore
01156             if (j_local.second == grain)
01157                 continue;
01158
01159             // if global neighbor not an active site of another grain, ignore
```

```

01160     if (!active_sites_check(j_local.first, j_local.second))
01161         continue;
01162
01163     array_coordinates& coordinates_j = lattice[j_local.second]->coordinates[j_local.first];
01164
01165     x_j = coordinates_j[0];
01166     y_j = coordinates_j[1];
01167     z_j = coordinates_j[2];
01168
01169     dx = x_i - x_j;
01170     dy = y_i - y_j;
01171     dz = z_i - z_j;
01172
01173     if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01174         dx = fabs(dx) - 2.*xmid;
01175
01176     if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01177         dy = fabs(dy) - 2.*ymid;
01178
01179     if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01180         dz = fabs(dz) - 2.*zmid;
01181
01182     rsq = dx*dx + dy*dy + dz*dz;
01183
01184     if (rsq <= cutoff)
01185     {
01186         int& type_j = (lattice[j_local.second]->iarray[0])[j_local.first];
01187         int& dep_flag_j = (lattice[j_local.second]->iarray[3])[j_local.first];
01188
01189         if (type_i[i] != type_j)
01190         {
01191             if (type_i[i] == 0)
01192             {
01193                 dep_flag_i[i] = -1;
01194                 dep_flag_j = -2;
01195                 flag = 1;    // if site i still is inhibited, flag = 1
01196             }
01197             else
01198             {
01199                 dep_flag_j = -1;
01200                 dep_flag_i[i] = -2;
01201                 flag = 1;
01202             }
01203         }
01204         else if ((type_i[i] == 1) && (type_j == 1))
01205         {
01206             dep_flag_i[i] = -2;
01207             dep_flag_j = -2;
01208             flag = 1;    // if site i still is inhibited, flag = 1
01209         }
01210     }
01211 }
01212
01213 // if initially the site has reached the other grain but now has changed
01214 // revert dep_flag back to 0
01215 if (flag == 0)
01216     dep_flag_i[i] = 0;

```

```

01217 }
01218 }

```

void AppEAM::check_grain_distance (int *site*, int *grain*) [private]

Checks the distance between active sites in grain and active site of other grains to see if the grains have met

Parameters

<i>site</i>	Local index of site that needs checking
<i>grain</i>	Grain ID that needs to be checked

Checks the distance between active sites in grain and neighbors from other grains to see if the grains are in close proximity of each other. If they are, change the `dep_flag` of those sites in proximity to either -1 or -2 depending on the type. This will inhibit deposition at those sites and will help identify sites that can undergo grain boundary diffusion and grain boundary migration.

```

01227 {
01228     if (!active_sites_check(site,grain))
01229         return;
01230
01231     int& type_i = (lattice[grain]->iarray[0])[site];
01232     int& dep_flag_i = (lattice[grain]->iarray[3])[site];
01233
01234     vec_int& global_neighbors = lattice[grain]->global_neighbors[site];
01235     int& num_global_neighbors = lattice[grain]->num_global_neighbors[site];
01236
01237     double x_i, y_i, z_i, x_j, y_j, z_j, dx, dy, dz, rsq;
01238     double cutoff = ((lattice[grain]->latconst)/1.01)*((lattice[grain]->latconst)/1.01);
01239
01240     double xmid = domain->midpoint(0);
01241     double ymid = domain->midpoint(1);
01242     double zmid = domain->midpoint(2);
01243
01244     array_coordinates& coordinates_i = lattice[grain]->coordinates[site];
01245
01246     x_i = coordinates_i[0];
01247     y_i = coordinates_i[1];
01248     z_i = coordinates_i[2];
01249
01250     int flag = 0;    // flag indicating whether dep_flag needs to be reverted back from -1
01251
01252     // this distance is chosen to avoid large gaps between grains
01253     for (int jj = 0; jj < num_global_neighbors; jj++)
01254     {
01255         int j = global_neighbors[jj];
01256         pair_int j_local = global_to_grain(j);
01257

```

```

01258 // if global neighbor is in the same grain, ignore
01259 if (j_local.second == grain)
01260     continue;
01261
01262 // if global neighbor not an active site of another grain, ignore
01263 if (!active_sites_check(j_local.first, j_local.second))
01264     continue;
01265
01266 array_coordinates& coordinates_j = lattice[j_local.second]->coordinates[j_local.first];
01267
01268 x_j = coordinates_j[0];
01269 y_j = coordinates_j[1];
01270 z_j = coordinates_j[2];
01271
01272 dx = x_i - x_j;
01273 dy = y_i - y_j;
01274 dz = z_i - z_j;
01275
01276 if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01277     dx = fabs(dx) - 2.*xmid;
01278
01279 if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01280     dy = fabs(dy) - 2.*ymid;
01281
01282 if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01283     dz = fabs(dz) - 2.*zmid;
01284
01285 rsq = dx*dx + dy*dy + dz*dz;
01286
01287 if (rsq <= cutoff)
01288 {
01289     int& type_j = (lattice[j_local.second]->iarray[0])[j_local.first];
01290     int& dep_flag_j = (lattice[j_local.second]->iarray[3])[j_local.first];
01291
01292     // if sites are less than the cutoff distance away and one of them is
01293     // unoccupied, the unoccupied site is inhibited
01294     if (type_i != type_j)
01295     {
01296         if (type_i == 0)
01297         {
01298             dep_flag_i = -1;
01299             dep_flag_j = -2;
01300             flag = 1; // if site i still is inhibited, flag = 1
01301         }
01302         else
01303         {
01304             dep_flag_j = -1;
01305             dep_flag_i = -2;
01306             flag = 1;
01307         }
01308     }
01309     else if ((type_i == 1) && (type_j == 1))
01310     {
01311         dep_flag_i = -2;
01312         dep_flag_j = -2;
01313         flag = 1; // if site i still is inhibited, flag = 1
01314     }

```

```

01315     }
01316   }
01317
01318   // if initially the site has reached the other grain but now has changed
01319   // revert dep_flag back to 0
01320   if (flag == 0)
01321     dep_flag_i = 0;
01322 }

```

void AppEAM::coord_update (int *i*, int *grain*) [private]

Updates the coordination number of site *i*

Parameters

<i>i</i>	Local index of site <i>i</i>
<i>grain</i>	Grain ID of site <i>i</i>

Updates coordination number for *i*'s neighbors, where the index *i* is a local (within the grain) index.

```

01583 {
01584   vec_int& type = lattice[grain]->iarray[0];
01585   vec_int& coordnum = lattice[grain]->iarray[2];
01586
01587   vec_int& num_neighbors = lattice[grain]->num_neighbors;
01588   vec_vec_int& neighbors = lattice[grain]->neighbors;
01589
01590   coordnum[i] = 0;
01591
01592   for (int jj = 0; jj < num_neighbors[i]; jj++)
01593   {
01594     int j = neighbors[i][jj];
01595     coordnum[j] = 0;
01596     for (int k = 0; k < num_neighbors[j]; k++)
01597     {
01598       if (type[neighbors[j][k]] != 0)
01599         coordnum[j]++;
01600     }
01601
01602     if (type[j] != 0)
01603       coordnum[i]++;
01604   }
01605 }

```

int AppEAM::determine_direction (int *i*, int *grain*) [private]

Determines the face that site *i* is closest to and which direction should be considered when determining whether step-edge and atom exchange moves for site *i*

Parameters

i	Local index of site i
$grain$	Grain ID of site i

Determines the face that site i is closest to and which direction should be considered when determining whether step-edge and atom exchange moves for site i .

This is a hack that would not be necessary if we use graph theory to map the diffusion sites.

0 is x-, 1 is x+, 2 is y-, 3 is y+, 4 is z-, and 5 is z+ Implementation: Loop over all first nearest neighbors of i . If the neighbor is occupied, boxed in ($coordnum > 6$) or $dep_flag = -1$, ignore the site. Find dx , dy , and dz from site i . For every time dx , dy , $dz \neq 0$, add it to the corresponding element in the direction array.

Function will find the max in the array to determine which direction has the highest number of vacant neighbors - that direction is the direction that step-edge/atom exchange will move in.

Example: if $loc = 5$, this means that site i may undergo step-edge/atom exchange in the z direction on the plane that is normal to the $z+$ direction

```
01616 {
01617   vec_int& dep_flag = lattice[grain]->iarray[3];
01618
01619   double xmid = domain->midpoint(0);
01620   double ymid = domain->midpoint(1);
01621   double zmid = domain->midpoint(2);
01622
01623   vec_int direction(6,0); // create 6x1 vector and initialize all values to zero
01624
01625   double x_loc, y_loc, z_loc;
01626   double j_x_loc, j_y_loc, j_z_loc;
01627   double dx, dy, dz;
01628
01629   vec_coordinates& coordinates = lattice[grain]->coordinates;
01630
01631   vec_vec_int& neighbors = lattice[grain]->neighbors;
01632   vec_int& num_neighbors = lattice[grain]->num_neighbors;
01633
01634   vec_int& coordnum = lattice[grain]->iarray[2];
01635
01636   vec_int& type = lattice[grain]->iarray[0];
01637
01638   // get local coordinates of site i
01639   x_loc = get_local_coordinates(coordinates[i], grain, 0);
01640   y_loc = get_local_coordinates(coordinates[i], grain, 1);
01641   z_loc = get_local_coordinates(coordinates[i], grain, 2);
01642
01650   for (int jj = 0; jj < num_neighbors[i]; jj++)
```

```

01651 {
01652     int j = neighbors[i][jj];
01653
01654     // if site is not vacant, skip
01655     if (type[j] != 0)
01656         continue;
01657
01658     // if dep_flag = -1 (vacant, on a grain boundary) - skip since we don't want
01659     // sites in the grain boundary to undergo atom exchange
01660     if (dep_flag[j] == -1)
01661         continue;
01662
01663     // if bulk, ignore
01664     if (coordnum[j] > 6)
01665         continue;
01666
01667     // get j's local coordinates
01668     j_x_loc = get_local_coordinates(coordinates[j], grain, 0);
01669     j_y_loc = get_local_coordinates(coordinates[j], grain, 1);
01670     j_z_loc = get_local_coordinates(coordinates[j], grain, 2);
01671
01672     // get the distance away from site i in terms of local coordinates
01673     dx = x_loc - j_x_loc;
01674     dy = y_loc - j_y_loc;
01675     dz = z_loc - j_z_loc;
01676
01677     // if periodic boundary condition is used, make sure dx, dy, and dz are correct
01678     if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01679         dx = fabs(dx) - 2.*xmid;
01680
01681     if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01682         dy = fabs(dy) - 2.*ymid;
01683
01684     if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01685         dz = fabs(dz) - 2.*zmid;
01686
01687     // every time dx, dy, dz is not zero, add it to the count in direction array
01688     // store them in the reverse order so that when we use max_element and there's
01689     // a case where two elements are equal, it will favor the z-direction
01690     if ((dx > 0.) && (fabs(dx) > 0.001))
01691         direction[5]++;
01692
01693     if ((dx < 0.) && (fabs(dx) > 0.001))
01694         direction[4]++;
01695
01696     if ((dy > 0.) && (fabs(dy) > 0.001))
01697         direction[3]++;
01698
01699     if ((dy < 0.) && (fabs(dy) > 0.001))
01700         direction[2]++;
01701
01702     if ((dz > 0.) && (fabs(dz) > 0.001))
01703         direction[1]++;
01704
01705     if ((dz < 0.) && (fabs(dz) > 0.001))
01706         direction[0]++;
01707

```

```

01708 }
01709
01710 int sum = std::accumulate(direction.begin(), direction.end(), 0);
01711
01721 // find where the max element in direction vector is (max_element returns an iterator)
01722 int loc = std::distance(direction.begin(), std::max_element(direction.begin(),
direction.end()));
01723
01724 loc = 5 - loc; // converting back to x->z ordering
01725
01726 // if there are no sites that satisfy the previous criteria, site i is at the grain
01727 // boundary
01728 if (sum == 0)
01729     loc = -1;
01730
01731 return loc;
01732 }

```

int AppEAM::edge_check (int *i*, int *grain*) [private]

Checks whether site *i* is at the edge of the simulation domain

Parameters

<i>i</i>	Local index of site <i>i</i>
<i>grain</i>	Grain ID of site <i>i</i>

Checks if site is at the edge of the box. This is based on the coordination number of the edge site being lower in non-periodic BCs.

```

01329 {
01330     vec_int& coordnum = lattice[grain]->iarray[2];
01331
01332     vec_coordinates& coordinates = lattice[grain]->coordinates;
01333
01334     double x = coordinates[i][0];
01335     double y = coordinates[i][1];
01336
01337     double x_max = domain->boxhi[0];
01338     double y_max = domain->boxhi[1];
01339
01340     // max distance away from the box boundary to be considered an edge site
01341     double max_dist = (lattice[grain]->next_site)*(lattice[grain]->latconst);
01342
01343     // if the site is at the edge of the box at the x-axis and is non-periodic in x
01344     if (((x <= max_dist) || (fabs(x - x_max) <= max_dist))
01345         && (domain->periodicity[0] == 0))
01346     {
01347         if (coordnum[i] >= 5) // coordination number of edge sites in the bulk >= 4
01348             return 1;
01349         else if ((y <= max_dist) || (fabs(y - y_max) <= max_dist)) && (coordnum[i] >= 3)
01350             // unless it is at the corner, in that case coordnum >= 3

```

```

01351     return 1;
01352     else
01353         return 0;
01354 }
01355 else if ((y <= max_dist) || (fabs(y - y_max) <= max_dist))
01356     && (domain->periodicity[1] == 0))
01357 {
01358     if (coordnum[i] >= 5)
01359         return 1;
01360     else if ((x <= max_dist) || (fabs(x - x_max) <= max_dist)) && (coordnum[i] >= 3))
01361         return 1;
01362     else
01363         return 0;
01364 }
01365 else
01366     return 0;
01367
01368 }

```

int AppEAM::exchange_destination (int *n*, int *grain*, int *direction*)
[private]

Check if site *n* is a possible destination for step-edge atom exchange and atom exchange in some direction

Parameters

<i>n</i>	Local index of site <i>n</i>
<i>grain</i>	Grain ID of site <i>n</i>
<i>direction</i>	Direction that step-edge is occurring

Check if site *n* is a possible destination for step-edge atom exchange and atom exchange in some direction. Function returns 0 or 1 depending on whether it is a possible exchange site or not. Criteria is that site *n*'s 4 nearest neighbors in the layer below it in the plane in which step-edge occurs have to be occupied. This is because step-edge is the movement from one terrace down to the layer below it. The layer below is a fully occupied layer because otherwise the atom will be hanging out from the terrace.

```

01741 {
01749     vec_int& type = lattice[grain]->iarray[0];
01750     vec_coordinates& coordinates = lattice[grain]->coordinates;
01751
01752     // if site is edge of box, return 1 since the rest of the criteria will not apply
01753     if (coordinates[n][floor(direction*0.5)] < (lattice[grain]->next_site)
01754         *((lattice[grain]->latconst)/1.01))
01755         return 1;
01756     vec_int& coordnum = lattice[grain]->iarray[2];
01757

```

```

01758 // if coordination number is not greater than 4 and not at the edge, the site cannot
01759 // be a potential destination for step-edge atom exchange
01760 if ((coordnum[n] < 5) && (coordinates[n][floor(direction*0.5)] >=
    (lattice[grain]->next_site)*((lattice[grain]->latconst)/1.01)))
01761     return 0;
01762
01763 vec_int& neighbors = lattice[grain]->neighbors[n];
01764 int& num_neighbors = lattice[grain]->num_neighbors[n];
01765
01766 double dx, dy, dz;
01767 int neigh_count = 0;
01768
01769 double xmid = domain->midpoint(0);
01770 double ymid = domain->midpoint(1);
01771 double zmid = domain->midpoint(2);
01772
01773 for (int jj = 0; jj < num_neighbors; jj++)
01774 {
01775     int j = neighbors[jj];
01776
01777     if (direction == 0)
01778     {
01779         dx = coordinates[n][0] - coordinates[j][0];
01780
01781         if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01782             dx = fabs(dx) - 2.*xmid;
01783
01784         if ((dx < 0.) && (fabs(dx) > 0.001) && (type[j] == 1))
01785             neigh_count++;
01786     }
01787     else if (direction == 1)
01788     {
01789         dx = coordinates[n][0] - coordinates[j][0];
01790
01791         if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01792             dx = fabs(dx) - 2.*xmid;
01793
01794         if ((dx > 0.) && (fabs(dx) > 0.001) && (type[j] == 1))
01795             neigh_count++;
01796     }
01797     else if (direction == 2)
01798     {
01799         dy = coordinates[n][1] - coordinates[j][1];
01800
01801         if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01802             dy = fabs(dy) - 2.*ymid;
01803
01804         if ((dy < 0.) && (fabs(dy) > 0.001) && (type[j] == 1))
01805             neigh_count++;
01806     }
01807     else if (direction == 3)
01808     {
01809         dy = coordinates[n][1] - coordinates[j][1];
01810
01811         if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01812             dy = fabs(dy) - 2.*ymid;
01813

```

```

01814     if ((dy > 0.) && (fabs(dy) > 0.001) && (type[j] == 1))
01815         neigh.count++;
01816     }
01817     else if (direction == 4)
01818     {
01819         dz = coordinates[n][2] - coordinates[j][2];
01820
01821         if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01822             dz = fabs(dz) - 2.*zmid;
01823
01824         if ((dz < 0.) && (fabs(dz) > 0.001) && (type[j] == 1))
01825             neigh.count++;
01826     }
01827     else if (direction == 5)
01828     {
01829         dz = coordinates[n][2] - coordinates[j][2];
01830
01831         if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01832             dz = fabs(dz) - 2.*zmid;
01833
01834         if ((dz > 0.) && (fabs(dz) > 0.001) && (type[j] == 1))
01835             neigh.count++;
01836     }
01837     }
01838     // if the 4 nearest neighbors above site n are vacant, return 1
01839     if (neigh.count == 4)
01840         return 1;
01841
01842     return 0;
01843
01844 }

```

void AppEAM::gen_seed_layer (class RandomPark * *random*, vec_int *seedlayer*) [private]

Generates a seed layer to initialize the simulation

Parameters

<i>random</i>	Random number generator
<i>seedlayer</i>	Vector of sites in the seed layer

Generates the seed layer for deposition to occur. App will not work without a seed layer since the propensity will be zero for all sites.

Two modes are possible: i) seed layer occupancy fraction is not 1 - sites are randomly assigned or deposition is on a foreign substrate and ii) seed layer occupancy fraction is 1 - polycrystalline substrate will be randomly generated.

```
00564 {
```

```

00565 pair<int> site_local;
00566
00567 int seed_count = 0; // counter for number of sites occupied in seed layer
00568 int ind = 0;
00569 double einitial;
00570 double efinal;
00571 int flag;
00572
00573 if (seed_frac != 1.0)
00574 // if the desired fraction is not 1, randomly assign atoms to sites in the seed layer
00575 {
00576     double xmid = domain->midpoint(0);
00577     double ymid = domain->midpoint(1);
00578     double zmid = domain->midpoint(2);
00579
00580     double dx, dy, dz, rsq;
00581     double cutoff = ((lattice[0]->latconst)/1.01)*((lattice[0]->latconst)/1.01);
00582
00583     while (seed_count <= seed_n)
00584     {
00585         // select site using random number
00586         ind = int (random->uniform()*seedlayer.size());
00587
00588         if (ind == seedlayer.size())
00589             // making sure that the index will not exceed the dim. of array
00590             ind--;
00591
00592         flag = 0;
00593         site_local = global_to_grain(seedlayer[ind]);
00594
00595         int& type_i = (lattice[site_local.second]->iarray[0])[site_local.first];
00596         vec<int>& num_global_neighbors = lattice[site_local.second]->num_global_neighbors;
00597         vec<vec<int>& global_neighbors = lattice[site_local.second]->global_neighbors;
00598
00599         array<coordinates>& coordinates_site = lattice[site_local.second]->
00600         coordinates[site_local.first];
00601
00602         // check global neighbors within cutoff to prevent overlap
00603         for (int i = 0; i < num_global_neighbors[site_local.first]; i++)
00604         {
00605             int j = global_neighbors[site_local.first][i];
00606             pair<int> j_local = global_to_grain(j);
00607
00608             array<coordinates>& coordinates_j = lattice[j_local.second]->coordinates[j_local.first];
00609
00610             dx = coordinates_site[0] - coordinates_j[0];
00611             dy = coordinates_site[1] - coordinates_j[1];
00612             dz = coordinates_site[2] - coordinates_j[2];
00613
00614             if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
00615                 dx = fabs(dx) - 2.*xmid;
00616
00617             if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
00618                 dy = fabs(dy) - 2.*ymid;
00619
00620             if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
00621                 dz = fabs(dz) - 2.*zmid;

```

```

00621
00622     rsq = dx*dx + dy*dy + dz*dz;
00623
00624     if (rsq >= cutoff)
00625         continue;
00626
00627     int& type_j = (lattice[j_local.second]->iarray[0])[j_local.first];
00628
00629     // if one of the site's neighbors from a different grain is occupied
00630     // this site has to be unoccupied (same idea as check_grain_distance)
00631     if ((type_j == 1) && (site_local.second != j_local.second))
00632         flag = 1; // flip the flag to prevent deposition
00633 }
00634
00635 // if no issues, try depositing a site here
00636 if (flag == 0)
00637 {
00638     einitial = system.energy(site_local.first,-1,0,site_local.second,site_local.second);
00639     // change type to occupied
00640     type_i = 1;
00641
00642     efinal = system.energy(site_local.first,-1,1,site_local.second,site_local.second);
00643
00644     // check energy
00645     if (efinal <= einitial)
00646     {
00647         seed.count++;
00648         efinal = system.energy(site_local.first,-1,2,site_local.second,site_local.second);
00649     }
00650     else // else, revert type back
00651     {
00652         type_i = 0;
00653     }
00654 }
00655 }
00656 }
00657 else
00658 {
00659     // 'grow' the seed up to seedlayer.size then polish it back down to 0.75*height
00660
00661     int seed_sites = lattice.count*2; // get the number of seed sites
00662
00663     int seed_sites_count = 0;
00664
00665     int next_grain = 0; // grain ID of next site - to ensure equal distribution of seeds
00666
00667     vec.int occ_sites; // vector containing occupied sites in seed
00668
00669     while (seed_sites_count < seed_sites)
00670     {
00671         ind = int (random->uniform()*seedlayer.size()); // pick a site
00672
00673         if (ind == seedlayer.size())
00674             // making sure that the index will not exceed the dim. of array
00675             ind--;
00676
00677         site_local = global_to_grain(seedlayer[ind]);

```

```

00678
00679     array_coordinates& coordinates_i = lattice[site_local.second]->
coordinates[site_local.first];
00680     int& type_i = (lattice[site_local.second]->iarray[0])[site_local.first];
00681
00682     // if the site is at the bottom z limit of box, plant the seed
00683     if ((coordinates_i[2] <= (lattice[site_local.second]->next_site)*
((lattice[site_local.second]->latconst)/1.01)) &&
00684         (site_local.second == next_grain))
00685     {
00686         type_i = 1;
00687         seed_sites_count++;
00688         occ_sites.push_back(seedlayer[ind]); // add to occ_sites
00689         seedlayer.erase(seedlayer.begin() + ind); // remove from seedlayer
00690         coord_update(site_local.first,site_local.second); // update coordnum
00691         // add to active_sites
00692         active_sites[site_local.second].push_back(site_local.first);
00693
00694         vec_int& num_neighbors = lattice[site_local.second]->num_neighbors;
00695         vec_vec_int& neighbors = lattice[site_local.second]->neighbors;
00696
00697
00698         check_grain_distance(site_local.first,site_local.second);
00699
00700         // add the nearest neighbors to active_sites as well
00701         for (int jj = 0; jj < num_neighbors[site_local.first]; jj++)
00702         {
00703             int j = neighbors[site_local.first][jj];
00704             active_sites[site_local.second].push_back(j);
00705             check_grain_distance(j,site_local.second);
00706         }
00707
00708         // update dep_flag
00709         update_dep_flag(site_local.second);
00710
00711         next_grain++; // move on to next grain
00712     }
00713     // if looped over all grains, start over
00714     if (next_grain == lattice_count)
00715         next_grain = 0;
00716 }
00717 // now fill in the rest based on the seed sites
00718 // let it loop over occ_sites.size() - this will grow as the number of occ_sites
00719 // increases
00720 int k = 0;
00721 while (k < occ_sites.size())
00722 {
00723     int site = occ_sites[k];
00724
00725     site_local = global_to_grain(site);
00726
00727     vec_int& num_neighbors = lattice[site_local.second]->num_neighbors;
00728     vec_vec_int& neighbors = lattice[site_local.second]->neighbors;
00729
00730     array_coordinates& coordinates_site = lattice[site_local.second]->
coordinates[site_local.first];
00731

```

```

00732     // loop over all first nearest neighbors
00733     for (int j = 0; j < num_neighbors[site.local.first]; j++)
00734     {
00735         // get global index to find site in seedlayer
00736         int neigh_global = grain.to_global(std::make_pair(neighbors[site.local.first][j],
site.local.second));
00737
00738         auto ind = std::find(seedlayer.begin(), seedlayer.end(), neigh_global);
00739
00740         // if the neighbor is in the seedlayer vector, it's a seed site
00741         if (ind != seedlayer.end())
00742         {
00743             site_local = global.to_grain(*ind);
00744
00745             int dep_flag_i = lattice[site_local.second]->iarray[3][site_local.first];
00746
00747             // check dep_flag to prevent overlaps and to avoid computing the
00748             // energy (sites that will cause efinal > einitial are excluded by
00749             // dep_flag)
00750             if (dep_flag_i != 1)
00751                 continue;
00752
00753             einitial = system.energy(site_local.first, -1, 0, site_local.second, site_local.second);
00754
00755             // change type to 1
00756             lattice[site_local.second]->iarray[0][site_local.first] = 1;
00757
00758             efinal = system.energy(site_local.first, -1, 1, site_local.second, site_local.second);
00759
00760             if (efinal > einitial)
00761             {
00762                 lattice[site_local.second]->iarray[0][site_local.first] = 0;
00763                 seedlayer.erase(ind);
00764                 continue;
00765             }
00766
00767             occ_sites.push_back(*ind);
00768             seedlayer.erase(ind);
00769             coord.update(site_local.first, site_local.second);
00770
00771             // if it was not in active_sites, add it
00772             if (!active_sites_check(site_local.first, site_local.second))
00773                 active_sites[site_local.second].push_back(site_local.first);
00774
00775             check_grain_distance(site_local.first, site_local.second);
00776
00777             for (int jj = 0; jj < num_neighbors[site_local.first]; jj++)
00778             {
00779                 int j = neighbors[site_local.first][jj];
00780                 if (!active_sites_check(j, site_local.second))
00781                 {
00782                     active_sites[site_local.second].push_back(j);
00783                     check_grain_distance(j, site_local.second);
00784                 }
00785             }
00786
00787             update_dep_flag(site_local.second);

```

```

00788     }
00789     }
00790     }
00791     k++;
00792 }
00793 // now that we have the substrate, we 'polish' it
00794 for (int i = 0; i < occ_sites.size(); i++)
00795 {
00796     site_local = global_to_grain(occ_sites[i]);
00797
00798     array_coordinates& coordinates_i = lattice[site_local.second]->coordinates[site_local.first];
00799
00800     if (coordinates_i[2] > polish.height)
00801         lattice[site_local.second]->iarray[0][site_local.first] = 0;
00802
00803     coord_update(site_local.first,site_local.second);
00804 }
00805 seed_n = occ_sites.size();
00806 }
00807 }

```

double AppEAM::get_local_coordinates (array_coordinates & coord, int grain, int direction) [private]

Calculates the local coordinates of a site

Parameters

<i>coord</i>	Coordinates of site
<i>grain</i>	Grain ID of site
<i>direction</i>	Direction (x, y, or z) of the local coordinates to return

Calculates the local 'direction'-coordinate of site.

```

01021 {
01022     matrix& inv_rot_mat = lattice[grain]->inv_rot_mat;
01023     array_coordinates& trans_mat = lattice[grain]->trans_mat;
01024     double local_coord;
01025
01026     if (direction == 0)
01027         local_coord = inv_rot_mat[0][0]*(coord[0] - trans_mat[0]) + inv_rot_mat[0][1]
01028             *(coord[1] - trans_mat[1]) + inv_rot_mat[0][2]*(coord[2] - trans_mat[2]);
01029     else if (direction == 1)
01030         local_coord = inv_rot_mat[1][0]*(coord[0] - trans_mat[0]) + inv_rot_mat[1][1]
01031             *(coord[1] - trans_mat[1]) + inv_rot_mat[1][2]*(coord[2] - trans_mat[2]);
01032     else if (direction == 2)
01033         local_coord = inv_rot_mat[2][0]*(coord[0] - trans_mat[0]) + inv_rot_mat[2][1]
01034             *(coord[1] - trans_mat[1]) + inv_rot_mat[2][2]*(coord[2] - trans_mat[2]);
01035     else
01036         error->all(FLERR, "Invalid direction");
01037     return local_coord;

```

```
01036
01037 }
```

```
virtual void SPPARKS_NS::AppEAM::grow_app ( ) [inline], [virtual]
```

```
00048 {};
```

```
void AppEAM::init_app ( ) [virtual]
```

Initialize the application before each run.

The function will initialize the EAM potential, calculate the current densities of deposition and dissolution, generate seed layer, and determine coordination number, dep_flag, etc. seed_n = specified fraction * number of sites in seed layer, rounded up to nearest integer

```
00247 {
00248 // initialize potential
00249 potential->init();
00250 pair = (PairEAM*)potential->pair;
00251
00252 // if potentiostatic, apply Butler-Volmer to get the current densities
00253 if (dep_mode == 1)
00254 {
00255     i_dep = i0*exp(-1. * alpha_c * eta * t.inverse);
00256     i_diss = i0*exp(alpha_a * eta * t.inverse);
00257
00258     if (pulse == 2)
00259     {
00260         i_a_dep = i0*exp(-1. * alpha_c * ox_rate * t.inverse);
00261         i_a_diss = i0*exp(alpha_a * ox_rate * t.inverse);
00262     }
00263 }
00264
00265 // vector of vector of doubles containing the propensity contribution of each
00266 // dep/diss event for each site
00267 dep_diss_prob.resize(N.total, vec_double(4, 0.));
00268
00269 if (pair == NULL)
00270     error->all(FLERR, "App EAM requires a pair potential");
00271
00272 if (temperature == 0.0)
00273     error->warning(FLERR, "Nothing will happen if temperature = 0.");
00274
00275 pair.int i_local;
00276
00277 // sum of dep/diss flags of each grain
00278 dep_sites_count_grain.resize(lattice_count, 0);
00279 diss_sites_count_grain.resize(lattice_count, 0);
```

```

00280
00281     vec_int seedlayer;
00282
00283     // find sites in seed layer
00284     for (int i = 0; i < lattice.count; i++)
00285     {
00286         int& N = lattice[i]->N;
00287
00288         vec_coordinates& coordinates = lattice[i]->coordinates;
00289
00290         for (int j = 0; j < N; j++)
00291         {
00292             if (coordinates[j][2] < seedlayer_size)
00293             {
00294                 il_local = std::make_pair(j,i);
00295                 seedlayer.push_back(GrainToGlobal(il_local));
00296             }
00297         }
00298     }
00299 }
00300
00301
00302
00303
00304     seed_n = static_cast<int> (ceil(seed_frac*seedlayer.size())); // number of occupied
sites in the seed layer
00305
00306     polish_height = 0.75*seedlayer_size;
00307
00308     if (seed_n > N_total)
00309         error->all(FLError, "Specified density exceeds number of sites");
00310
00311     if (seed_n > 0)
00312         gen_seed_layer(ranapp, seedlayer);
00313
00314     std::cout << "Seeded " << seed_n << " sites." << std::endl;
00315
00316     // initializes coordination number, dep.flags, and active_sites
00317     for (int k = 0; k < lattice.count; k++)
00318     {
00319         int& N = lattice[k]->N;
00320
00321         active_sites[k].clear(); // clear out active_sites and start over to prevent
double counting them
00322
00323         vec_int& num_neighbors = lattice[k]->num_neighbors;
00324         vec_vec_int& neighbors = lattice[k]->neighbors;
00325         vec_int& coordnum = lattice[k]->iarray[2];
00326         vec_int& dep_flag = lattice[k]->iarray[3];
00327         vec_coordinates& coordinates = lattice[k]->coordinates;
00328         vec_int& grainid = lattice[k]->iarray[1];
00329
00330         for (int i = 0; i < N; i++)
00331         {
00332             coord_update(i,k);
00333             // identify the edges of the active site
00334             if ((coordnum[i] != 12) && (coordnum[i] != 0))
00335                 active_sites[k].push_back(i);

```

```

00336
00337     if ((seed_n == 0) && (coordinates[i][2] < (lattice[k]->next_site)*
((lattice[k]->latconst)/1.01)))
00338         active_sites[k].push_back(i);
00339
00340     grainid[i] = k;    // assign grain id
00341     dep_flag[i] = 0;  // clear out dep_flag
00342 }
00343
00344
00345 }
00346
00347 // check whether grain needs growing
00348 for (int k = 0; k < lattice_count; k++)
00349 {
00350     vec_int& type = lattice[k]->iarray[0];
00351     // check the grain (only check occupied active sites)
00352     for (int i = 0; i < active_sites[k].size(); i++)
00353     {
00354         if (type[active_sites[k][i]] == 1)
00355             update_status(i,k,0);
00356     }
00357 }
00358
00359 // check the distance between grains and flag any sites that are in close proximity
00360 for (int k = 0; k < lattice_count; k++)
00361     check_grain_distance(k);
00362
00363 dep_sites_count = 0;    // reset dep_sites_count - it might have been changed by
gen_seed_layer
00364 diss_sites_count = 0;
00365
00366 // update dep_flag
00367 for (int k = 0; k < lattice_count; k++)
00368 {
00369     dep_sites_count_grain[k] = 0;    // clear out grain count
00370     diss_sites_count_grain[k] = 0;    // clear out grain count
00371     update_dep_flag(k);    // now update dep_flag
00372 }
00373 }

```

int AppEAM::neighbor_check (int *i*, int *j*, int *grain*) [private]

Checks whether site *j* is a 2nd nearest neighbor of site *i*

Parameters

<i>i</i>	Local index of site <i>i</i>
----------	------------------------------

j	Local index of site j
$grain$	Grain ID of the two sites

Check if j is already part of neighbors2[i]

```

00813 {
00814     vec_int& num_neighbors2 = lattice[grain]->num_neighbors2;
00815     vec_vec_int& neighbors2 = lattice[grain]->neighbors2;
00816
00817     if (i == j)
00818         return 1;
00819
00820     if (j == -1)
00821         return 1;
00822
00823     if (num_neighbors2[i] == 0)
00824         return 0;
00825
00826     // using stl to do the search instead of for loop
00827     auto loc = std::find(neighbors2[i].begin(), neighbors2[i].end(), j);
00828
00829     if (loc != neighbors2[i].end())
00830         return 1;
00831
00832     // lattice site not in 2nd nearest neighbors list
00833     return 0;
00834 }

```

void AppEAM::scale_propensities () [private]

Scales the deposition propensities such that the average = propensity with i_{dep}

Calculates the average propensity for each event based on the propensities stored in `dep_diss_prob`. Divide that average by the desired average propensity based on the current density. The quotient of that is the scaling factor. Update the scaling factor and apply the change to all sites in question.

```

00410 {
00411     diss_sites.clear(); // clear old data
00412     dep_sites.clear();
00413
00414     double sum = 0.0;
00415     double scale = 1.;
00416     double area = (domain->length(0))*(domain->length(1));
00417
00418     // find the deposition and dissolution sites whose propensity is > 1e-10
00419     // loop over active sites in each grain
00420     for (int j = 0; j < lattice_count; j++)
00421     {
00422         for (int ii = 0; ii < active_sites[j].size(); ii++)

```

```

00423     {
00424         int i = active_sites[j][ii];
00425         int k = grain_to_global(std::make_pair(i,j));
00426         // find all sites that can undergo deposition
00427         if ((lattice[j]->iarray[3][i] == 1) && (lattice[j]->iarray[0][i] == 0)
00428             && (propensity[k] > 1e-10))
00429             dep_sites.push_back(k);
00430         // now all sites that can undergo dissolution
00431         else if ((lattice[j]->iarray[3][i] == 2) && (lattice[j]->iarray[0][i] == 1)
00432             && (propensity[k] > 1e-10))
00433             diss_sites.push_back(k);
00434     }
00435 }
00436 // start with deposition
00437 for (int i = 0; i < dep_sites.size(); i++)
00438 {
00439     // remove the contribution from total propensity for now, will add scaled value back to it
00440     propensity[dep_sites[i]] -= dep_diss_prob[dep_sites[i]][0];
00441     sum += dep_diss_prob[dep_sites[i]][0]; // add it to sum
00442 }
00443
00444 // find numx - area is in Angstroms^2, so we need to convert to nm^2
00445 double numx = dep_sites.count*100./area;
00446 // i_dep is in pA/nm^2, 1e-12 is to convert it to A/nm^2
00447 double avg = i_dep * 1.e-12/ (z_me*charge*numx); // desired average propensity
00448
00449 sum = sum / dep_sites.size(); // divide by dep_sites.size() to get 'average' propensity
00450
00451 if (sum < 1e-15) // to prevent divide by zero error
00452     scale = 1.;
00453 else
00454     scale = avg/sum; // get the new scaling parameter
00455
00456 scale_dep_on *= scale; // apply that to existing scaling parameter
00457
00458 for (int i = 0; i < dep_sites.size(); i++)
00459 {
00460     dep_diss_prob[dep_sites[i]][0] *= scale; // apply the scale to old probs
00461     propensity[dep_sites[i]] += dep_diss_prob[dep_sites[i]][0]; // add back to propensity
00462 }
00463 // now dep rate when turned off - only in pulse-reverse
00464 if (pulse == 2)
00465 {
00466     sum = 0.; // zero out sum
00467
00468     // again, remove contribution from propensity, add that to sum
00469     for (int i = 0; i < dep_sites.size(); i++)
00470     {
00471         propensity[dep_sites[i]] -= dep_diss_prob[dep_sites[i]][1];
00472         sum += dep_diss_prob[dep_sites[i]][1];
00473     }
00474
00475     avg = i_a_dep * 1.e-12/ (z_me*charge*numx); // desired average propensity
00476
00477     sum = sum / dep_sites.size(); // divide by dep_sites.size() to get 'average' propensity

```

```

00478
00479     if (sum < 1e-15) // to prevent divide by zero error
00480         scale = 1.;
00481     else
00482         scale = avg/sum; // get the new scaling parameter
00483
00484     scale_dep_off *= scale;
00485
00486     for (int i = 0; i < dep_sites.size(); i++)
00487     {
00488         dep_diss_prob[dep_sites[i]][1] *= scale; // apply the scaling factor
00489         propensity[dep_sites[i]] += dep_diss_prob[dep_sites[i]][1]; // add back to propensity
00490     }
00491 }
00492 solve->update(dep_sites,propensity); // update the solver
00493
00494 // now for dissolution events - first check if there are any sites that fit the criteria
00495 if (diss_sites.size() != 0)
00496 {
00497     sum = 0.0; // clear out sum
00498
00499     // repeat same procedure
00500     for (int i = 0; i < diss_sites.size(); i++)
00501     {
00502         propensity[diss_sites[i]] -= dep_diss_prob[diss_sites[i]][2];
00503         sum += dep_diss_prob[diss_sites[i]][2];
00504     }
00505
00506     numx = diss_sites_count*100./area; // now with diss_sites_count for dissolution
00507     avg = i_diss * 1.e-12/ (z_me*charge*numx); // desired average propensity
00508
00509     sum = sum / diss_sites.size(); // divide by dep_sites.size() to get 'average' propensity
00510     if (sum < 1e-15)
00511         scale = 1.;
00512     else
00513         scale = avg/sum; // get the new scaling parameter
00514
00515     scale_diss_on *= scale;
00516
00517     for (int i = 0; i < diss_sites.size(); i++)
00518     {
00519         dep_diss_prob[diss_sites[i]][2] *= scale; // apply the scaling factor
00520         propensity[diss_sites[i]] += dep_diss_prob[diss_sites[i]][2]; // add back to propensity
00521     }
00522
00523     // diss rate when off -only in PR
00524     if (pulse == 2)
00525     {
00526         sum = 0.;
00527         for (int i = 0; i < diss_sites.size(); i++)
00528         {
00529             propensity[diss_sites[i]] -= dep_diss_prob[diss_sites[i]][3];
00530             sum += dep_diss_prob[diss_sites[i]][3];
00531         }
00532
00533         avg = i_a_diss * 1.e-12/ (z_me*charge*numx); // desired average propensity
00534         sum = sum / diss_sites.size(); // divide by dep_sites.size() to get 'average' propensity

```

```

00535
00536     if (sum < 1e-15)
00537         scale = 1.;
00538     else
00539         scale = avg/sum; // get the new scaling parameter
00540
00541     scale_diss_off *= scale;
00542
00543     for (int i = 0; i < diss_sites.size(); i++)
00544     {
00545         dep_diss_prob[diss_sites[i]][3] *= scale; // apply the scaling factor
00546         propensity[diss_sites[i]] += dep_diss_prob[diss_sites[i]][3]; // add back to propensity
00547     }
00548 }
00549 solve->update(diss_sites,propensity); // update solver
00550 }
00551
00552 }

```

void AppEAM::setup_app () [virtual]

Set up the application.

Calculate the potential at each site before the propensities are computed.

```

00380 {
00381     // compute the site energies for the first time
00382     for (int j = 0; j < lattice_count; j++)
00383     {
00384         for (int i = 0; i < lattice[j]->N; i++)
00385             pair->energy(i, j, lattice[j]->num_global_neighbors, lattice[j]->global_neighbors,
00386                 lattice[j]->coordinates, lattice[j]->iarray[0], lattice[j]->darray[0], lattice[j]->darray[1]);
00387     }
00388
00389     max_eng = -3.54;
00390 }

```

void AppEAM::setup_end_app () [virtual]

Set up the application after propensity is computed.

Scale the propensities before application starts

```

00398 {
00399     scale_propensities();
00400 }

```

double AppEAM::site_energy (int *i*, int *grain*) [virtual]

Computes the energy of site *i*

```
01373 {
01374   vec_int& type = lattice[grain]->iarray[0];
01375
01376   vec_double& rho = lattice[grain]->darray[0];
01377   vec_double& phi = lattice[grain]->darray[1];
01378
01379   vec_coordinates& coordinates = lattice[grain]->coordinates;
01380   vec_int& num_global_neighbors = lattice[grain]->num_global_neighbors;
01381   vec_vec_int& global_neighbors = lattice[grain]->global_neighbors;
01382
01383   if (type[i] != 0)
01384     return pair->energy(i, grain, num_global_neighbors, global_neighbors, coordinates, type, rho,
01385                        phi);
01385   else
01386     return 0.;
01387 }
```

void AppEAM::site_event (int *i*, class RandomPark * *random*) [virtual]

KMC method - choose and perform an event for site. See comments in site_propensity for explanation of how events are identified. energy after proposed move

```
02358 {
02359   if (propensity[i] == 0.)
02360   {
02361     naccept--;
02362     return;
02363   }
02364
02365   // if plating was originally on but now have exceeded on time, turn it off
02366   if ((pulse != 0) && (pulse_on == 1) && ((time - prev_time) > on_dt))
02367   {
02368     pulse_on = 0;
02369     prev_time = time;
02370   }
02371   // if it was off but have exceeded off time, turn it on
02372   else if ((pulse != 0) && (pulse_on == 0) && ((time - prev_time) > off_dt))
02373   {
02374     pulse_on = 1;
02375     prev_time = time;
02376   }
02377
02378   pair_int i_local = global_to_grain(i);
02379
02380   int jj;
02381
02382   vec_int& type = lattice[i_local.second]->iarray[0];
```

```

02383 vec_int& coordnum = lattice[i_local.second]->iarray[2];
02384 vec_int& dep_flag = lattice[i_local.second]->iarray[3];
02385
02386 vec_coordinates& coordinates = lattice[i_local.second]->coordinates;
02387 vec_int& num_neighbors = lattice[i_local.second]->num_neighbors;
02388 vec_vec_int& neighbors = lattice[i_local.second]->neighbors;
02389 vec_int& num_global_neighbors = lattice[i_local.second]->num_global_neighbors;
02390 vec_vec_int& global_neighbors = lattice[i_local.second]->global_neighbors;
02391 vec_int& num_neighbors2 = lattice[i_local.second]->num_neighbors2;
02392 vec_vec_int& neighbors2 = lattice[i_local.second]->neighbors2;
02393 double xmid = domain->midpoint(0);
02394 double ymid = domain->midpoint(1);
02395 double zmid = domain->midpoint(2);
02396
02397 // sites = array of site indices that have to be updated
02398 sites.clear();
02399
02400 // clear out diff_sites
02401 // first column of diff_sites contains the indices to sites that i can diffuse to
02402 // the second column is a flag indicating the diffusion mechanism
02403 // 0 = grain boundary diffusion; 1 = hopping; 2 = atom exchange on plateau;
02404 // 3 = atom exchange on edge
02405
02406 diff_sites.clear();
02407
02408 // zero out diff_count
02409 int diff_count = 0;
02410 int grain_j = i_local.second;
02411 int j = -1;
02412 int flag = 0; // flag to indicate diffusion across a grain (=1)
02413 int step_flag = 0; // flag to indicate whether step-edge atom exchange is possible or not
02414 double e_initial;
02415 double prob = 0.0;
02416 double e_final;
02417
02418 // threshold = random number * total propensity of site i
02419 double threshold = random->uniform()*propensity[i];
02420
02421 i = i_local.first;
02422
02423 // we only need to update the status of the site and the system energy
02424 if (type[i] == 0)
02425 {
02426     if (count >= n_max)
02427     {
02428         naccept--;
02429         return;
02430     }
02431
02432     if ((dep_flag[i] == 1) && (pulse_on == 1))
02433     {
02434         e_initial = system.energy(i, j, 0, i_local.second, i_local.second);
02435
02436         type[i] = 1;
02437
02438         // find surface area in (Angstroms)^2
02439         double area = (domain->length(0))*(domain->length(1));

```

```

02440
02441 // possible dep sites per unit area (sites/nm^2)
02442 double numx = dep_sites_count*100./area;
02443
02444 efinal = system_energy(i, j, 1, i_local.second, i_local.second);
02445
02446 // Budevski et al. p.28
02447 prob += i_dep * 1.e-12 *(efinal - einitial) * scale_dep_on / (
    z_me*charge*numx*max_eng);
02448
02449 if (prob >= threshold)
02450 {
02451 // need to run system_energy to calculate the energy after the move
02452 // otherwise, the energy will not be updated
02453 efinal = system_energy(i, j, 2, i_local.second, i_local.second);
02454 count++;
02455 grain.j = i_local.second;
02456 goto update;
02457 }
02458 else
02459 {
02460 type[i] = 0;
02461 naccept--;
02462 return;
02463 }
02464 }
02465 // deposition during anodic part of pulse-reverse
02466 else if ((dep_flag[i] == 1) && (pulse == 2) && (pulse_on == 0))
02467 {
02468 einitial = system_energy(i, j, 0, i_local.second, i_local.second);
02469
02470 type[i] = 1;
02471
02472 // find surface area in (Angstroms)^2
02473 double area = (domain->length(0))*(domain->length(1));
02474
02475 // possible dep sites per unit area (sites/nm^2)
02476 double numx = dep_sites_count*100./area;
02477
02478 efinal = system_energy(i, j, 1, i_local.second, i_local.second);
02479
02480 // Budevski et al. p.28
02481 prob += i_a_dep * 1.e-12 *(efinal - einitial)*scale_dep_off / (
    z_me*charge*numx*max_eng);
02482
02483 if (prob >= threshold)
02484 {
02485 // need to run system_energy to calculate the energy after the move
02486 // otherwise, the energy will not be updated
02487 efinal = system_energy(i, j, 2, i_local.second, i_local.second);
02488 count++;
02489 grain.j = i_local.second;
02490 goto update;
02491 }
02492 else
02493 {
02494 type[i] = 0;

```

```

02495         naccept--;
02496         return;
02497     }
02498 }
02499
02500 // if neither are satisfied
02501 naccept--;
02502 return;
02503
02504 }
02505 // if the event is diffusion, have to loop over all possible diffusion sites
02506 else
02507 {
02508     // special case of diffusion - grain boundary migration
02509     // the event will affect sites in 2 different grains
02510     for (int kk = 0; kk < num_global_neighbors[i]; kk++)
02511     {
02512         // int k = global_neighbors[i][kk];
02513         // pair_int k_local = global_to_grain(k);
02514         //
02515         // if they are in the same grain, ignore it
02516         // if (k_local.second == i_local.second)
02517         //     continue;
02518         //
02519         // we have already identified possible destination sites using dep_flag
02520         // when dep_flag[k] = -1, atom i can diffuse to site k (based on the
02521         // criteria of assigning -1 to dep_flag)
02522         // vec_int& dep_flag_k = lattice[k_local.second]->iarray[3];
02523         //
02524         // if dep_flag[k] is not -1, the two sites are not close enough
02525         // if (dep_flag_k[k_local.first] != -1)
02526         //     continue;
02527         //
02528         // vec_int& type_k = lattice[k_local.second]->iarray[0];
02529         //
02530         // e_initial = system_energy(i, k_local.first, 0, i_local.second, k_local.second);
02531         //
02532         // type[i] = 0;
02533         // type_k[k_local.first] = 1;
02534         //
02535         // e_final = system_energy(i, k_local.first, 1, i_local.second, k_local.second);
02536         //
02537         // if (e_final <= e_initial)
02538         //     prob += v_grain*exp(-Ed_grain*t.inverse);
02539         // else // if e_final > e_initial, this event is impossible
02540         //     prob += v_grain*exp(-(Ed_grain + e_final - e_initial)*t.inverse);
02541         //
02542         // if (prob >= threshold)
02543         // {
02544         //     e_final = system_energy(i, k_local.first, 2, i_local.second, k_local.second);
02545         //
02546         //     j = k_local.first;
02547         //     grain_j = k_local.second;
02548         //     n_grain++;
02549         //
02550         //     flag = 1;
02551         //

```

```

02552 //          // flip the dep_flag of i and k as well since they swap states
02553 //          dep_flag[i] = -1;
02554 //          dep_flag_k[k.local.first] = -2;
02555 //          break;
02556 //      }
02557 //      else
02558 //      {
02559 //          type_k[k.local.first] = 0;
02560 //          type[i] = 1;
02561 //          j = -1;
02562 //      }
02563 //  }
02564 //
02565 //      if (j != -1)
02566 //          goto update;
02567 //
02568
02569      if (coordinates[i][2] < (lattice[i.local.second]->next_site)
02570          *((lattice[i.local.second]->latconst)/1.01))
02571      {
02572          naccept--;
02573          return;
02574      }
02575      // dissolution when not pulse-reverse
02576      if ((dep_flag[i] == 2) && (pulse_on == 1) && (count < n_max))
02577      {
02578          einitial = system_energy(i, j, 0, i.local.second, i.local.second);
02579
02580          type[i] = 0;
02581
02582          // get efinal without permanently changing the energy
02583          efinal = system_energy(i, j, 1, i.local.second, i.local.second);
02584
02585          double area = (domain->length(0))*(domain->length(1)); // find surface area in (Angstroms)^2
02586
02587          double numx = diss_sites_count*100./area; // possible dep sites per unit area
02588              (sites/nm^2)
02589
02590          // only need einitial, efinal is zero
02591          // sites with higher energy is less negative, max_eng/einitial will be higher
02592          prob += i_diss * 1.e-12 * max_eng*scale_diss_on / (
02593              z_me*charge*numx*(einitial-efinal));
02594          //      prob += i_diss * 1.e-12 / (z_me*charge*numx);
02595
02596          if (prob >= threshold)
02597          {
02598              // need to run system_energy to calculate the energy after the move
02599              // otherwise, the energy will not be updated
02600              efinal = system_energy(i, j, 2, i.local.second, i.local.second); // energy after
02601              proposed move
02602              n_diss++;
02603              grain_j = i.local.second;
02604              goto update;
02605          }
02606          else
02607              type[i] = 1;

```

```

02605
02606     }
02607     // anodic part of pulse-reverse -- remove sites at i_a_diss
02608     if ((dep_flag[i] == 2) && (pulse_on == 0) && (pulse == 2) && (
        count < n_max))
02609     {
02610         e_initial = system_energy(i, j, 0, i_local.second, i_local.second);
02611
02612         type[i] = 0;
02613
02614         // get e_final without permanently changing the energy
02615         e_final = system_energy(i, j, 1, i_local.second, i_local.second);
02616
02617         double area = (domain->length(0))*(domain->length(1)); // find surface area in (Angstroms)^2
02618
02619         double numx = diss_sites_count*100./area; // possible dep sites per unit area
        (sites/nm^2)
02620
02621         // sites with higher energy is less negative, max_eng/(e_initial-e_final) will be higher
02622         prob += i_a_diss * 1.e-12 * max_eng* scale_diss_off/
        (z_me*charge*numx*(e_initial-e_final)); // convert i_dep to A/nm^2 and calculate propensity
02623
02624         if (prob >= threshold)
02625         {
02626             // need to run system_energy to calculate the energy after the move
02627             // otherwise, the energy will not be updated
02628             e_final = system_energy(i, j, 2, i_local.second, i_local.second);
02629             n_diss++;
02630             grain_j = i_local.second;
02631             goto update;
02632         }
02633         else
02634             type[i] = 1;
02635     }
02636 }
02637
02638 if (coordnum[i] > 6)
02639 {
02640     n_accept--;
02641     return;
02642 }
02643
02644 if (edge_check(i, i_local.second))
02645 {
02646     n_accept--;
02647     return;
02648 }
02649
02650 // loop over first nearest neighbors to see if there's any neighbor that has
02651 // dep_flag = -1 (close to or overlapping with another grain)
02652 // if there is, change step_flag to -1 to prevent step-edge atom exch
02653 for (int kk = 0; kk < num_neighbors[i]; kk++)
02654 {
02655     int k = neighbors[i][kk];
02656
02657     if (dep_flag[k] == -1)
02658         step_flag = 1;

```

```

02659 }
02660
02661 // get the direction that the local coordinate of i and j will be compared
02662 int direction = determine_direction(i, i.local.second);
02663 int dir;
02664 double local.coord.i, local.coord.k, local.coord.n;
02665
02666 if (direction != -1)
02667 {
02668     dir = static_cast<int> (floor(direction*0.5));
02669     local.coord.i = get_local_coordinates(coordinates[i], i.local.second, dir)
;
02670
02671     // if we're dealing with lower limit, multiply the coordinate by -1 to get the
02672     // right comparison
02673     if (direction % 2 == 0)
02674         local.coord.i *= -1;
02675 }
02676
02677 double dx, dy, dz, rsq;
02678 double cutoff = (lattice[i.local.second]->latconst)*(lattice[i.local.second]->latconst);
02679 // find diff_sites and diff_count
02680 // diff_sites is an array containing the indices of sites that i can diffuse to
02681 for (int kk = 0; kk < num_global_neighbors[i]; kk++)
02682 {
02683     int k = global_neighbors[i][kk];
02684     pair_int k_local = global_to_grain(k);
02685
02686     int& type_k = (lattice[k_local.second]->iarray[0])[k_local.first];
02687     int& coordnum_k = (lattice[k_local.second]->iarray[2])[k_local.first];
02688     int& dep_flag_k = (lattice[k_local.second]->iarray[3])[k_local.first];
02689
02690     array_coordinates& coordinates_k = lattice[k_local.second]->coordinates[k_local.first];
02691
02692     dx = coordinates[i][0] - coordinates_k[0];
02693     dy = coordinates[i][1] - coordinates_k[1];
02694     dz = coordinates[i][2] - coordinates_k[2];
02695
02696     if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
02697         dx = fabs(dx) - 2.*xmid;
02698
02699     if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
02700         dy = fabs(dy) - 2.*ymid;
02701
02702     if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
02703         dz = fabs(dz) - 2.*zmid;
02704
02705     rsq = dx*dx + dy*dy + dz*dz;
02706
02707     if (rsq > cutoff)
02708         continue;
02709
02710     // hopping mechanism across grains
02711     // coordnum should be > 1, or else we're diffusing into thin air
02712     if ((i.local.second != k_local.second) && (type_k == 0)
02713         && (coordnum_k > 1) && (dep_flag[i] == -2)
02714         && (exchange_destination(k_local.first, k_local.second, direction)))

```

```

02715     {
02716         // hopping to another grain on the surface
02717         diff_sites.push_back(int_array_2 ());
02718         diff_sites[diff_count][1] = 4;
02719         diff_sites[diff_count][0] = k;
02720         diff_count++;
02721     }
02722 }
02723 } // end of global neighbors loop
02724
02725 for (int kk = 0; kk < num_neighbors[i]; kk++)
02726 {
02727     int k = neighbors[i][kk];
02728
02729     if (direction != -1)
02730     {
02731         local_coord.k = get_local_coordinates(coordinates[k], i_local.second, dir);
02732
02733         if (direction % 2 == 0)
02734             local_coord.k *= -1;
02735     }
02736     // regular hopping
02737     if ((type[k] == 0) && (coordnum[k] > 1) && (dep_flag[k] != -1))
02738     {
02739         // special case - grain boundary diffusion
02740         // assume that it happens only via hopping for now
02741         // Herzig2005 and Suzuki2005
02742         diff_sites.push_back(int_array_2 ());
02743
02744         if (dep_flag[i] == -2)
02745             diff_sites[diff_count][1] = 0;
02746         else
02747             diff_sites[diff_count][1] = 1;
02748
02749         diff_sites[diff_count][0] = k;
02750         diff_count++; // # of possible diffusion sites
02751     }
02752
02753     if ((type[k] == 1) && (local_coord.k < local_coord.i) && (coordnum[k] >= 6)
02754         && (direction != -1) && (dep_flag[i] != -2))
02755         // exchange
02756         {
02757             for (int nn = 0; nn < num_neighbors[k]; nn++)
02758             {
02759                 int n = neighbors[k][nn]; // destination site
02760
02761                 if (dep_flag[n] == -1)
02762                     continue;
02763
02764                 if (type[n] != 0)
02765                     continue;
02766
02767                 if (exchange_destination(n, i_local.second, direction) == 0)
02768                     continue;
02769
02770                 local_coord.n = get_local_coordinates(coordinates[n], i_local.second, dir);
02771

```

```

02772         if (direction % 2 == 0)
02773             local_coord.n *= -1;
02774
02775         if ((fabs(local_coord.n - local_coord.i) < 0.001)
02776             && (coordnum[k] >= 8))
02777         {
02778             // atom exchange
02779             diff_sites.push_back(int_array_2 ());
02780             diff_sites[diff_count][0] = n;
02781             diff_sites[diff_count][1] = 2;
02782             diff_count++;
02783         }
02784         else if ((fabs(local_coord.n - local_coord.k) < 0.001)
02785                 && (coordnum[k] < 8) && (step_flag == 0)
02786                 && ((direction % 2 == 0)
02787                     && (coordinates[i][dir] < coordinates[n][dir])
02788                     && (fabs(coordinates[i][dir]-coordinates[n][dir]) > 0.001))
02789                 || ((direction % 2 == 1)
02790                     && (coordinates[i][dir] > coordinates[n][dir])
02791                     && (fabs(coordinates[i][dir]-coordinates[n][dir]) > 0.001))))
02792         {
02793             // step edge atom exchange
02794             diff_sites.push_back(int_array_2 ());
02795             diff_sites[diff_count][0] = n;
02796             diff_sites[diff_count][1] = 3;
02797             diff_count++;
02798         }
02799     } // end of exchange loop
02800 } // end of nearest neighbors loop
02801 // if we are assuming that the diffusion rate is the same for all configurations
02802 // and sites
02803 // if diff is independent of the energy of the system
02804 for (int k = 0; k < diff_count; k++)
02805 {
02806     j = diff_sites[k][0]; // find site j from diff_sites
02807     grain_j = i_local.second;
02808     pair_int j_local;
02809
02810     // special case for hopping - hop across grains
02811     if (diff_sites[k][1] == 4)
02812     {
02813         j_local = global_to_grain(j);
02814         j = j_local.first;
02815         grain_j = j_local.second;
02816
02817         einitial = system_energy(i, j_local.first, 0, i_local.second, j_local.second);
02818
02819         // type[j] = 1
02820         lattice[j_local.second]->iarray[0][j_local.first] = 1;
02821         type[i] = 0;
02822
02823         efinal = system_energy(i, j_local.first, 1, i_local.second, j_local.second);
02824     }
02825     else
02826     {
02827         einitial = system_energy(i, j, 0, i_local.second, i_local.second);

```

```

02829
02830     type[j] = 1;
02831     type[i] = 0; // in surface diffusion, i becomes vacant
02832     efinal = system_energy(i, j, 1, i_local.second, i_local.second);
02833 }
02834
02835 if (efinal <= einitial)
02836 {
02837     if (diff_sites[k][1] == 0)
02838         prob += v_boundary*exp(-1.0*Ed_boundary*t.inverse);
02839     else if ((diff_sites[k][1] == 1) || (diff_sites[k][1] == 4))
02840         prob += v_d*exp(-1.0*Ed*t.inverse);
02841     else if (diff_sites[k][1] == 2)
02842         prob += v_exch*exp(-1.0*Ed_exch*t.inverse);
02843     else if (diff_sites[k][1] == 3)
02844         prob += v_step*exp(-1.0*Ed_step*t.inverse);
02845
02846     if (prob >= threshold)
02847     {
02848         efinal = system_energy(i, j, 2, i_local.second, grain_j); // do the energy update
02849         if (diff_sites[k][1] == 0)
02850             n_boundary++;
02851         else if (diff_sites[k][1] == 1)
02852             n_hop++;
02853         else if (diff_sites[k][1] == 2)
02854             n_atomexch++;
02855         else if (diff_sites[k][1] == 3)
02856             n_step++;
02857         else if (diff_sites[k][1] == 4)
02858             n_hop++;
02859
02860         break; // move accepted, break the for loop
02861     }
02862     else
02863     // if prob < threshold, restore the types if i and j
02864     {
02865         if (diff_sites[k][1] != 4)
02866             type[j] = 0;
02867         else
02868             lattice[j_local.second]->iarray[0][j_local.first] = 0;
02869
02870         type[i] = 1;
02871         j = -1; // set j = -1 since nothing happened
02872     }
02873 }
02874 else
02875 {
02876     if (diff_sites[k][1] == 0)
02877         prob += v_boundary*exp(-1.0*(Ed_boundary + efinal - einitial)*t.inverse);
02878     else if ((diff_sites[k][1] == 1) || (diff_sites[k][1] == 4))
02879         prob += v_d*exp(-1.0*(Ed + efinal - einitial)*t.inverse);
02880     else if (diff_sites[k][1] == 2)
02881         prob += v_exch*exp(-1.0*(Ed_exch + efinal - einitial)*t.inverse);
02882     else if (diff_sites[k][1] == 3)
02883         prob += v_step*exp(-1.0*(Ed_step + efinal - einitial)*t.inverse);
02884
02885     if (prob >= threshold)

```

```

02886     {
02887         efinal = system_energy(i, j, 2, i_local.second, grain_j); // do the energy update
02888         if (diff_sites[k][1] == 0)
02889             n_boundary++;
02890         else if (diff_sites[k][1] == 1)
02891             n_hop++;
02892         else if (diff_sites[k][1] == 2)
02893             n_atomexch++;
02894         else if (diff_sites[k][1] == 3)
02895             n_step++;
02896         else if (diff_sites[k][1] == 4)
02897             n_hop++;
02898
02899         break;
02900     }
02901     else // restore the types if i and j
02902     {
02903         if (diff_sites[k][1] != 4)
02904             type[j] = 0;
02905         else
02906             lattice[j_local.second]->iarray[0][j_local.first] = 0;
02907
02908         type[i] = 1;
02909         j = -1;
02910     }
02911 } // end of diff_count loop
02912 } // end of diff_count loop
02913
02914 if (j == -1) // if nothing happened, skip the rest and return
02915 {
02916     naccept--;
02917     return;
02918 }
02919 goto update;
02920
02921 }
02922 update:
02923 coord_update(i, i_local.second); // update the coordination numbers
02924
02925 if (j != -1) // if there's a site j, update that too
02926     coord_update(j, grain_j);
02927
02928 // check the status of i as an active site and check if grain needs growing
02929 update_status(i, i_local.second, 1);
02930
02931 // same for j if there is a site j
02932 if (j != -1)
02933     update_status(j, grain_j, 1);
02934
02935 // check distance between grains
02936 check_grain_distance(i, i_local.second);
02937
02938 for (int mm = 0; mm < num_neighbors[i]; mm++)
02939     check_grain_distance(neighbors[i][mm], i_local.second);
02940
02941 if (j != -1)
02942 {

```

```

02943     check_grain_distance(j, grain_j);
02944
02945     for (int mm = 0; mm < lattice[grain_j]->num_neighbors[j]; mm++)
02946         check_grain_distance(lattice[grain_j]->neighbors[j][mm], grain_j);
02947 }
02948
02949 if (grain_j != i_local.second)
02950     flag = 1; // flip the flag so that the update is done on the right grain
02951
02952 for (int m = 0; m < lattice_count; m++)
02953     update_dep_flag(m);
02954
02955 scale_propensities();
02956
02957 // update the propensities for site i and its 2nd nearest neighbors - use global indices
02958 int ii = grain_to_global(i_local);
02959 sites.push_back(ii);
02960 propensity[ii] = site_propensity(ii);
02961
02962 for (int mm = 0; mm < num_neighbors2[i]; mm++)
02963 {
02964     int m = neighbors2[i][mm];
02965     pair_int grain_m = std::make_pair(m, i_local.second);
02966     m = grain_to_global(grain_m);
02967     sites.push_back(m);
02968     propensity[m] = site_propensity(m);
02969 }
02970
02971 if (j != -1) // if diffusion, need to update j and its 2nd nn as well
02972 {
02973     if (flag == 0) // if same grain
02974     {
02975         if (!neighbor_check(i, j, i_local.second))
02976         {
02977             jj = grain_to_global(std::make_pair(j, grain_j));
02978             sites.push_back(jj);
02979             propensity[jj] = site_propensity(jj);
02980         }
02981         for (int mm = 0; mm < num_neighbors2[j]; mm++)
02982         {
02983             int m = neighbors2[j][mm];
02984             if (!neighbor_check(i, m, i_local.second))
02985                 // if it's a '2nd nn' of i, it would have already been taken care of in
02986                 // the first for loop; this check is there to optimize the update
02987             {
02988                 pair_int grain_m = std::make_pair(m, i_local.second);
02989                 m = grain_to_global(grain_m);
02990                 sites.push_back(m);
02991                 propensity[m] = site_propensity(m);
02992             }
02993         }
02994     }
02995     else // if another grain is affected, flag = 1 and the update is done differently
02996     {
02997         jj = grain_to_global(std::make_pair(j, grain_j));
02998         sites.push_back(jj);
02999         propensity[jj] = site_propensity(jj);

```

```

03000
03001     vec_int& num_neighbors2_j = lattice[grain_j]->num_neighbors2;
03002     vec_vec_int& neighbors2_j = lattice[grain_j]->neighbors2;
03003
03004     for (int mm = 0; mm < num_neighbors2_j[j]; mm++)
03005     {
03006         int m = neighbors2_j[j][mm];
03007         pair_int grain_m = std::make_pair(m, grain_j);
03008         m = grain_to_global(grain_m);
03009         sites.push_back(m);
03010         propensity[m] = site_propensity(m);
03011     }
03012 }
03013 }
03014 }
03015
03016 // update
03017 solve->update(sites, propensity);
03018 }

```

```

virtual void SPPARKS_NS::AppEAM::site_event_rejection ( int , class
RandomPark * ) [inline], [virtual]

```

```

00055 { };

```

```

double AppEAM::site_propensity ( int i ) [virtual]

```

KMC method – compute total propensity of owned site summed over possible events The integer ‘dir’ is the direction that is normal to the surface at site i.

General Hopping Mechanism: Atom at site i can hop to a nearest neighbor site in the same grain or to a vacant surface site of another grain. For this to occur, the destination site, referred to as site k, will have to be vacant and its coordination number has to be greater than 1 to avoid diffusing into air.

Hopping to Another Surface Site (Different Grains): Same conditions as the general case, but a check is added to ensure that site k is a surface site of the grain.

General Exchange Mechanism: The intermediate site k will have a lower local ‘dir’-coordinate than that of site i. The intermediate site will also have to be part of the crystal, hence coordnum[k] >= 6. The direction has to be a valid direction (!= -1) and the dep_flag of site i is not -2 (occupied and in proximity of an active site from another grain).

Atom Exchange: Sites i and n are in the plane where their local ‘dir’-coordinates are equal. The coordination number of the intermediate site k should also be >= 8 to ensure that the site is ‘buried’ in the layer below.

Step Edge Atom Exchange: For step edge atom exchange, the intermediate site k and destination site n have the same ‘dir’ coordinate. The coordination number of k should be less than 8 such that it is part of the crystal but not completely in the bulk. The mod of direction will determine whether the event is occurring in the + or - direction with respect to ‘dir’-coordinate. If the mod is 0, i is at the - direction and destination site n will have a higher ‘dir’-coordinate than site i . The last condition that $\text{fabs}(\text{coordinates}[i][\text{dir}]-\text{coordinates}[n][\text{dir}]) > 0.001$ is to ensure that the two sites are in different layers.

```

01850 {
01851     int i_global = i;
01852
01853     pair<int> i_local = global.to_grain(i);
01854
01855     double prob = 0.0;
01856
01857     int flag = 0;    // flag to indicate whether step-edge atom exchange is possible or not
01858
01859     i = i_local.first;    // get the local i and overwrite i
01860
01861     vec<int>& type = lattice[i_local.second]->iarray[0];
01862     vec<int>& coordnum = lattice[i_local.second]->iarray[2];
01863     vec<int>& dep_flag = lattice[i_local.second]->iarray[3];
01864
01865     vec<coordinates>& coordinates = lattice[i_local.second]->coordinates;
01866     vec<int>& num_neighbors = lattice[i_local.second]->num_neighbors;
01867     vec<vec<int>&> neighbors = lattice[i_local.second]->neighbors;
01868     vec<int>& num_global_neighbors = lattice[i_local.second]->num_global_neighbors;
01869     vec<vec<int>&> global_neighbors = lattice[i_local.second]->global_neighbors;
01870     vec<int>& num_neighbors2 = lattice[i_local.second]->num_neighbors2;
01871     vec<vec<int>&> neighbors2 = lattice[i_local.second]->neighbors2;
01872
01873     double xmid = domain->midpoint(0);
01874     double ymid = domain->midpoint(1);
01875     double zmid = domain->midpoint(2);
01876
01877     // SPPARKS will calculate the propensities of all sites before performing site_event
01878     // site_event will only update the propensities of affected sites
01879
01880     // propensity of all events at site i
01881     // possible events: adsorption and diffusion, depending on the type of site i
01882     // if the site is part of the bulk or in the vacuum, return prob = 0
01883     if ((coordnum[i] == 12) || (coordnum[i] == 0))
01884         return prob;
01885     // if the temperature is 0 K, the rate = 0
01886     if (temperature == 0.0)
01887         return prob;
01888
01889     int j = -1;    // diffusion destination site index, -1 for adsorption
01890
01891     double e_initial;    // energy of initial configuration
01892     double e_final;
01893
01894     if (type[i] == 0)

```

```

01895 {
01896 // if dep_flag[i] = -1 or 0, return prob = 0
01897 if (dep_flag[i] != 1)
01898     return prob;
01899
01900 if (count >= n_max)
01901     return prob;
01902
01903 einitial = system.energy(i, j, 0, i_local.second, i_local.second);
01904
01905 type[i] = 1;
01906
01907 // get efinal without permanently changing the energy
01908 efinal = system.energy(i, j, 1, i_local.second, i_local.second);
01909
01910 type[i] = 0;
01911
01912 double area = (domain->length(0))*(domain->length(1)); // find surface area in (Angstroms)^2
01913
01914 double numx = dep_sites.count*100./area; // possible dep sites per unit area
01915     (sites/nm^2)
01916 // convert i_dep to A/nm^2 and calculate propensity
01917 double prob_tmp = i_dep * 1.e-12 * (efinal - einitial)*scale_dep_on/ (
01918     z_me*charge*numx*max_eng);
01919
01920 if (prob_tmp < 0.) // if calculated prob is < 0, let it = 0
01921 // this can occasionally happen in the seeding, but should not be frequent
01922 {
01923     dep_diss_prob[i_global][0] = 0.;
01924 }
01925 else
01926 {
01927     prob += prob_tmp;
01928     dep_diss_prob[i_global][0] = prob_tmp;
01929 }
01930
01931 if (pulse == 2)
01932 {
01933     einitial = system.energy(i, j, 0, i_local.second, i_local.second);
01934
01935     type[i] = 1;
01936
01937 // find surface area in (Angstroms)^2
01938 double area = (domain->length(0))*(domain->length(1));
01939
01940 // possible dep sites per unit area (sites/nm^2)
01941 double numx = dep_sites.count*100./area;
01942
01943 efinal = system.energy(i, j, 1, i_local.second, i_local.second);
01944
01945 type[i] = 0;
01946 // convert i_a_dep to A/nm^2 and calculate propensity
01947 double prob_tmp = i_a_dep * 1.e-12 *(efinal - einitial)*
01948     scale_dep_off/ (z_me*charge*numx*max_eng);
01949
01950 if (prob_tmp < 0.)
01951 {

```

```

01949     dep_diss_prob[i_global][1] = 0.;
01950     }
01951     else
01952     {
01953         // Budevski et al. p.28
01954         prob += prob_tmp;
01955         dep_diss_prob[i_global][1] = prob_tmp;
01956     }
01957 }
01958
01959 }
01960
01961 if (type[i] != 0)
01962 {
01963     for (int kk = 0; kk < num_neighbors[i]; kk++)
01964     {
01965         int k = neighbors[i][kk];
01966
01967         if ((coordnum[k] == 1) && (type[k] == 1))
01968             // if coordnum of one of i's neighbors is 1, that site will end up
01969             // floating in space when i diffuses away
01970             // this cannot happen, so if this is the case, i cannot diffuse
01971             return prob = 0.0;
01972     }
01973
01974     if (coordinates[i][2] < (lattice[i_local.second]->next_site)
01975         *((lattice[i_local.second]->latconst)/1.01))
01976         return prob;
01977
01978     // dissolution
01979     if ((dep_flag[i] == 2) && (count < n_max))
01980     {
01981         e_initial = system_energy(i, j, 0, i_local.second, i_local.second);
01982
01983         type[i] = 0;
01984
01985         // get e_final without permanently changing the energy
01986         e_final = system_energy(i, j, 1, i_local.second, i_local.second);
01987
01988         type[i] = 1;
01989
01990         double area = (domain->length(0))*(domain->length(1)); // find surface area in (Angstroms)^2
01991
01992         double numx = diss_sites_count*100./area; // possible dep sites per unit area
01993         (sites/nm^2)
01994         // sites with higher energy is less negative, max_eng/(e_initial-e_final) will be higher
01995         // if no i_diss is specified, the default is zero
01996         double prob_tmp = i_diss * 1.e-12 * (max_eng) *
01997             scale_diss_on/ (z_me*charge*numx*(e_initial-e_final)); // convert i_dep to A/nm^2 and
01998             calculate propensity
01999
02000         if (prob_tmp < 0.)
02001         {
02002             dep_diss_prob[i_global][2] = 0.;
02003         }
02004     }
02005     else
02006     {

```

```

02002     prob += prob_tmp;
02003     dep_diss_prob[i_global][2] = prob_tmp;
02004 }
02005
02006 }
02007 // anodic part of pulse-reverse -- remove sites at i_a_diss
02008 if ((dep_flag[i] == 2) && (pulse == 2) && (count < n_max))
02009 {
02010     e_initial = system.energy(i, j, 0, i_local.second, i_local.second);
02011
02012     type[i] = 0;
02013
02014     // get e_final without permanently changing the energy
02015     e_final = system.energy(i, j, 1, i_local.second, i_local.second);
02016
02017     type[i] = 1;
02018
02019     double area = (domain->length(0))*(domain->length(1)); // find surface area in (Angstroms)^2
02020
02021     double numx = diss_sites_count*100./area; // possible dep sites per unit area
02022     (sites/nm^2)
02023     // sites with higher energy is less negative, max_eng/(e_initial-e_final) will be higher
02024     double prob_tmp = i_a_diss * 1.e-12 * (max_eng)*
02025     scale_diss_off / (z_me*charge*numx*(e_initial-e_final)); // Budevski et al. p.28
02026
02025
02026     if (prob_tmp < 0.)
02027     {
02028         dep_diss_prob[i_global][3] = 0.;
02029     }
02030     else
02031     {
02032         prob += prob_tmp;
02033         dep_diss_prob[i_global][3] = prob_tmp;
02034     }
02035 }
02036 }
02037
02038 // // If site is occupied it can participate in diffusion across grains.
02039 // for (int kk = 0; kk < num_global_neighbors[i]; kk++)
02040 // {
02041 //     int k = global_neighbors[i][kk];
02042 //     pair.int k_local = global_to_grain(k);
02043 //
02044 //     // if they are in the same grain, ignore it
02045 //     if (k_local.second == i_local.second)
02046 //         continue;
02047 //
02048 //     // we have already identified possible destination sites using dep_flag
02049 //     // when dep_flag[k] = -1, atom i can diffuse to site k (based on the
02050 //     // criteria of assigning -1 to dep_flag)
02051 //     vec.int& dep_flag_k = lattice[k_local.second]->iarray[3];
02052 //
02053 //     // if dep_flag[k] is not -1, the two sites are not close enough
02054 //     if (dep_flag_k[k_local.first] != -1)
02055 //         continue;

```

```

02056 //
02057 //     vec.int& type_k = lattice[k_local.second]->iarray[0];
02058 //
02059 //     einitial = system.energy(i,k_local.first,0,i_local.second, k_local.second);
02060 //
02061 //     type[i] = 0;
02062 //     type_k[k_local.first] = 1;
02063 //
02064 //     efinal = system.energy(i,k_local.first,1,i_local.second, k_local.second);
02065 //
02066 //     type_k[k_local.first] = 0;
02067 //     type[i] = 1;
02068 //
02069 //     if (efinal <= einitial)
02070 //         prob += v_grain*exp(-Ed_grain*t.inverse);
02071 //     else
02072 //         // if we're moving to a higher energy state, need to account for the
02073 //         // configuration-specific increase in activation energy of the move
02074 //         prob += v_grain*exp(-(Ed_grain + efinal - einitial)*t.inverse);
02075 //
02076 //     }
02077
02078     if (edge_check(i,i_local.second))
02079         // if it is the edge and is part of the crystal, no diffusion (for non PBC)
02080         return prob;
02081
02082     // if site is part of the bulk, it cannot undergo diffusion
02083     if (coordnum[i] > 6)
02084         return prob;
02085
02086     // loop over first nearest neighbors to see if there's any neighbor that has
02087     // dep_flag = -1 (close to or overlapping with another grain)
02088     // if there is, change flag to -1 to prevent step-edge atom exch
02089     for (int kk = 0; kk < num_neighbors[i]; kk++)
02090     {
02091         int k = neighbors[i][kk];
02092
02093         if (dep_flag[k] == -1)
02094             flag = 1;
02095     }
02096
02097     // surface diffusion, site i becomes vacant while destination j becomes occupied
02098
02099     // determine the direction that is normal to site i; function returns int [0,5]
02100     int direction = determine_direction(i, i_local.second);
02101     double local_coord_i, local_coord_k, local_coord_n;
02102     int dir;
02103
02104     // function returns -1 when site is not exposed to the solution
02105     if (direction != -1)
02106     {
02107         dir = static_cast<int> (floor(direction*0.5));
02108         local_coord_i = get_local_coordinates(coordinates[i], i_local.second, dir);
02109
02110         // if we're dealing with lower limit, multiply the coordinate by -1 to get the
02111         // right comparison
02112         if (direction % 2 == 0)

```

```

02114     local_coord.i *= -1;
02115 }
02116
02117 double dx, dy, dz, rsq;
02118 // define cutoff for diffusion involving sites from different grains - use latconst
02119 double cutoff = (lattice[i_local.second]->latconst)*(lattice[i_local.second]->latconst);
02120
02121 // hopping to another grain on the surface - loop over global_neighbors
02122 for (int kk = 0; kk < num_global_neighbors[i]; kk++)
02123 {
02124     int k = global_neighbors[i][kk];
02125     pair_int k_local = global_to_grain(k);
02126
02127     int& type_k = (lattice[k_local.second]->iarray[0])[k_local.first];
02128     int& coordnum_k = (lattice[k_local.second]->iarray[2])[k_local.first];
02129     int& dep_flag_k = (lattice[k_local.second]->iarray[3])[k_local.first];
02130
02131     array_coordinates& coordinates_k = lattice[k_local.second]->coordinates[k_local.first];
02132
02133     dx = coordinates[i][0] - coordinates_k[0];
02134     dy = coordinates[i][1] - coordinates_k[1];
02135     dz = coordinates[i][2] - coordinates_k[2];
02136
02137     if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
02138         dx = fabs(dx) - 2.*xmid;
02139
02140     if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
02141         dy = fabs(dy) - 2.*ymid;
02142
02143     if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
02144         dz = fabs(dz) - 2.*zmid;
02145
02146     rsq = dx*dx + dy*dy + dz*dz;
02147
02148     // if outside of cutoff, ignore that site
02149     if (rsq > cutoff)
02150         continue;
02151
02152     if ((i_local.second != k_local.second) && (type_k == 0)
02153         && (coordnum_k > 1) && (dep_flag_k == -1) && (dep_flag[i] == -2)
02154         && (exchange_destination(k_local.first, k_local.second, direction)))
02155     {
02156         // hopping to another grain on the surface
02157
02158         einitial = system_energy(i, k_local.first, 0, i_local.second, k_local.second);
02159
02160         type_k = 1; // update the type of site j
02161         type[i] = 0; // in surface diffusion, i becomes vacant
02162
02163         efinal = system_energy(i, k_local.first, 1, i_local.second, k_local.second);
02164
02165         // restore the types
02166         type_k = 0;
02167         type[i] = 1;
02168
02169         if (efinal <= einitial)
02170             prob += v_d*exp(-1.*Ed*t.inverse);

```

```

02183
02184     else
02185         prob += v.d*exp(-1.*(Ed + efinal - einitial)*t.inverse);
02186     }
02187 }
02188 }
02189 for (int kk = 0; kk < num_neighbors[i]; kk++)
02190 {
02191     int k = neighbors[i][kk];
02192     if (direction != -1)
02193     {
02194         local_coord_k = get_local_coordinates(coordinates[k], i_local.second, dir);
02195
02196         if (direction % 2 == 0)
02197             local_coord_k *= -1;
02198     }
02199     if ((type[k] == 0) && (coordnum[k] > 1) && (dep_flag[k] != -1))
02200     {
02201         // hopping
02202         // cannot diffuse to a site that has coordnum <= 1, it will be floating
02203         // if type[nearest neighbors] = 0, find the propensity of the move
02204         j = k;
02205
02206         einitial = system_energy(i, j, 0, i_local.second, i_local.second);
02207
02208         type[j] = 1; // update the type of site j
02209         type[i] = 0; // in surface diffusion, i becomes vacant
02210
02211         efinal = system_energy(i, j, 1, i_local.second, i_local.second);
02212
02213         // restore the types
02214         type[j] = 0;
02215         type[i] = 1;
02216
02217         if (efinal <= einitial)
02218         {
02219             if (dep_flag[i] == -2) // special case, grain boundary diffusion
02220                 prob += v_boundary*exp(-1.*Ed_boundary*t.inverse);
02221             else // otherwise, regular hopping
02222                 prob += v.d*exp(-1.*Ed*t.inverse);
02223         }
02224     }
02225     else
02226     {
02227         // if we're moving to a higher energy state, need to account for the
02228         // configuration-specific increase in activation energy of the move
02229         if (dep_flag[i] == -2)
02230             prob += v_boundary*exp(-1.*(Ed_boundary + efinal - einitial)*t.inverse);
02231         else
02232             prob += v.d*exp(-1.*(Ed + efinal - einitial)*t.inverse);
02233     }
02234 }
02235 else if ((type[k] == 1) && (local_coord_k < local_coord_i)
02236         && (coordnum[k] >= 6) && (direction != -1) && (dep_flag[i] != -2))
02237 // exchange mechanism
02238 // coordnum = 6 is a kink site, can still participate in exchange
02239 // find intermediate sites, k, whose z[k] < z[i] (lower plane)
02240 // Antczak and Ehrlich, p. 88-104

```

```

02249 {
02250   for (int nn = 0; nn < num_neighbors[k]; nn++)
02251   {
02252     // loop over 1st nearest neighbors of k to find destination site
02253     int n = neighbors[k][nn]; // destination site
02254
02255     // if n is near an active site from another grain, move on
02256     if (dep_flag[n] == -1)
02257       continue;
02258
02259     if (type[n] != 0)
02260       continue;
02261
02262     // if n is not a possible exchange destination, move on
02263     if (exchange_destination(n, i_local.second, direction) == 0)
02264       continue;
02265
02266     local_coord_n = get_local_coordinates(coordinates[n], i_local.second, dir);
02267
02268     if (direction % 2 == 0)
02269       local_coord_n *= -1;
02270
02271     if ((fabs(local_coord_n - local_coord_i) < 0.001)
02272         && (coordnum[k] >= 8))
02273     {
02281       // atom exchange on a plateau
02282       // atom i will displace atom k, pushing atom m up to the same plane
02283       // as where i was initially
02284
02285       j = n;
02286
02287       einitial = system_energy(i, j, 0, i_local.second, i_local.second);
02288
02289       type[j] = 1;
02290       type[i] = 0;
02291
02292       efinal = system_energy(i, j, 1, i_local.second, i_local.second);
02293
02294       type[j] = 0;
02295       type[i] = 1;
02296
02297       if (efinal <= einitial)
02298         prob += v_exch*exp(-1.0*Ed_exch*t.inverse);
02299       else
02300         prob += v_exch*exp(-1.0*(Ed_exch+efinal-einitial)*t.inverse);
02301     }
02302     else if ((fabs(local_coord_n - local_coord_k) < 0.001)
02303              && (coordnum[k] < 8) && (flag == 0)
02304              && (((direction % 2 == 0)
02305                  && (coordinates[i][dir] < coordinates[n][dir])
02306                  && (fabs(coordinates[i][dir]-coordinates[n][dir]) > 0.001))
02307                || ((direction % 2 == 1)
02308                    && (coordinates[i][dir] > coordinates[n][dir])
02309                    && (fabs(coordinates[i][dir]-coordinates[n][dir]) > 0.001))))
02310     {
02325       // step edge atom exchange at edges
02326       // atom i will displace atom k, pushing atom k outwards

```

```

02327         // coordnum[k] < 8 to ensure that it is at the edge
02328         j = n;
02329
02330         einitial = system.energy(i,j,0,i.local.second,i.local.second);
02331
02332         type[j] = 1;
02333         type[i] = 0;
02334
02335         efinal = system.energy(i,j,1,i.local.second,i.local.second);
02336
02337         type[j] = 0;
02338         type[i] = 1;
02339
02340         if (efinal <= einitial)
02341             prob += v.step*exp(-1.0*Ed.step*t.inverse);
02342         else
02343             prob += v.step*exp(-1.0*(Ed.step+efinal-einitial)*t.inverse);
02344     }
02345 }
02346 }
02347 }
02348 }
02349
02350 return prob;
02351 }

```

void AppEAM::stats (char * *strtmp*)

```

03024 {
03025     char big[8],format[256];
03026     strcpy(big,BIGINT_FORMAT);
03027
03028     if (solve)
03029     {
03030         sprintf(format,"%%10g %%10%s %%10d %%10d %%10d %%10d %%10d %%10d %%10d %%10d
%%10d %%10d %%10g %%10g",&big[1]);
03031         sprintf(strtmp, format, time, naccept, n_hop, n_atomexch,
n_step, n_boundary, n_grain, count, n_diss,
dep_sites_count, diss_sites_count, scale_dep_on,
scale_diss_on);
03032     }
03033     else
03034     {
03035         sprintf(format,"%%10g %%10%s %%10%s %%10d %%10d %%10d %%10d %%10d %%10d
%%10d %%10d %%10g %%10g",&big[1],&big[1]);
03036         sprintf(strtmp, format, time, naccept, n_hop, n_atomexch,
n_step, n_boundary, n_grain, count, n_diss,
dep_sites_count, diss_sites_count, scale_dep_on,
scale_diss_on);
03037     }
03038 }

```

```
void AppEAM::stats_header ( char * strtmp )
```

```
03045 {
03046   sprintf(strtmp,"%10s %10s %10s", "Time",
        "Naccept","N_hop", "N.atomexch", "N.steppedge", "N.boundary", "N.grain", "N.dep", "N.diss",
        "sum_dep", "sum_diss", "scale_dep", "scale_diss");
03047 }
```

```
double AppEAM::system_energy ( int i, int j, int flag, int grain_i, int
grain_j ) [private]
```

Calculates the energy of sites affected by a move

Parameters

<i>i</i>	Local index of site in question
<i>j</i>	If the event is a diffusion event, local index of destination site
<i>flag</i>	Flag to indicate whether a permanent update of the energies is required or not
<i>grain_i</i>	Grain ID of the site <i>i</i>
<i>grain_j</i>	Grain ID of the site <i>j</i>

Computes the energy of system for before or after a proposed change Function will calculate the energy of the system after a proposed change in *i* calling `site_energy` for site *i* and its 2nd nearest neighbors.

This is because when site *i* is changed, the energy of its 2nd nearest neighbors are also affected. But the change of site *i* will not affect its neighbors that is outside the cutoff range of site *i*.

The function is used to determine `einitial` and `efinal` to calculate the change in the energy of the system after some change.

The `flag` is to indicate `einitial` (`flag = 0`), `efinal` without overwrite (`flag = 1`), `efinal` with overwrite (`flag = 2`). When `flag = 2`, the `phis` from `phi_old` are not restored into `phi`.

When the function is run with `flag = 0`, as is the case when calculating `einitial`, the function will also find the indices of sites that will be affected by some change in *i* and *j*. This is stored in the `n x 3` vector `phi_old`. The first column in `phi_old` stores the indices of the sites. The second column stores the `phis` of the sites before any change is made to the system. The last column stores the new values of `phis`.

```
01393 {
01417   double eng = 0.0;
```

```

01418
01419 if (flag == 0)
01420 {
01421     double xmid = domain->midpoint(0);
01422     double ymid = domain->midpoint(1);
01423     double zmid = domain->midpoint(2);
01424     double dx, dy, dz, rsq;
01425     // use latconst as the cutoff
01426     double cutoff = (lattice[0]->latconst)*(lattice[0]->latconst);
01427
01428     // initialize the references to the grain data
01429     double& phi_i = (lattice[grain_i]->darray[1])[i];
01430     // create a copy of i's global.neighbors list
01431     vec.int global.neighbors_i(lattice[grain_i]->global.neighbors[i]);
01432     int num_global.neighbors_i = lattice[grain_i]->num_global.neighbors[i];
01433     array.coordinates& coordinates_i = lattice[grain_i]->coordinates[i];
01434
01435     old.eng = 0.0; // zero out old.eng
01436
01437     for (int kk = 0; kk < lattice.count; kk++)
01438     {
01439         for (int k = 0; k < lattice[kk]->N; k++)
01440             old.eng += lattice[kk]->darray[1][k]; // add up energy before change
01441     }
01442
01443     // clear out phi_old
01444     phi_old.clear();
01445
01446     phi_old.push_back(array.coordinates());
01447     phi_old[0][0] = grain.to_global(std::make_pair(i, grain_i));
01448     phi_old[0][1] = phi_i; // start adding sites that will see their energy changed
01449
01450     phi_old.count = 1; // number of sites whose phi are stored in phi_old
01451     // loop over global neighbors (within EAM potential cutoff)
01452     for (int kk = num_global.neighbors_i-1; kk >= 0; kk--)
01453     {
01454         int k = global.neighbors_i[kk];
01455         pair.int k.local = global.to_grain(k);
01456
01457         array.coordinates& coordinates_k = lattice[k.local.second]->coordinates[k.local.first];
01458
01459         dx = coordinates_i[0] - coordinates_k[0];
01460         dy = coordinates_i[1] - coordinates_k[1];
01461         dz = coordinates_i[2] - coordinates_k[2];
01462
01463         if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01464             dx = fabs(dx) - 2.*xmid;
01465
01466         if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01467             dy = fabs(dy) - 2.*ymid;
01468
01469         if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01470             dz = fabs(dz) - 2.*zmid;
01471
01472         rsq = dx*dx + dy*dy + dz*dz;
01473
01474         // ignore sites outside the cutoff

```

```

01475     if (rsq > cutoff)
01476     {
01477         global_neighbors.i.erase(global_neighbors.i.begin() + kk);
01478         continue;
01479     }
01480     phi_old.push_back(array_coordinates());
01481     phi_old[phi_old.count][0] = k;
01482     phi_old[phi_old.count][1] = lattice[k.local.second]->darray[1][k.local.first];
01483     phi_old.count++;
01484 }
01485
01486 // if the event is surface diffusion, the energy of site j and its 2nd
01487 // nearest neighbor are also stored in phi_old
01488 if (j != -1)
01489 {
01490     double& phi_j = lattice[grain_j]->darray[1][j];
01491
01492     vec_int& global_neighbors_j = lattice[grain_j]->global_neighbors[j];
01493     array_coordinates& coordinates_j = lattice[grain_j]->coordinates[j];
01494
01495     phi_old.push_back(array_coordinates());
01496     phi_old[phi_old.count][0] = grain_to_global(std::make_pair(j, grain_j));
01497     phi_old[phi_old.count][1] = phi_j;
01498     phi_old.count++;
01499
01500     // no need to create a copy for j's global_neighbor list
01501     for (int kk = 0; kk < global_neighbors_j.size(); kk++)
01502     {
01503         int k = global_neighbors_j[kk];
01504         pair_int k_local = global_to_grain(k);
01505
01506         array_coordinates& coordinates_k = lattice[k_local.second]->coordinates[k_local.first];
01507
01508         dx = coordinates_j[0] - coordinates_k[0];
01509         dy = coordinates_j[1] - coordinates_k[1];
01510         dz = coordinates_j[2] - coordinates_k[2];
01511
01512         if ((fabs(dx) > xmid) && (domain->periodicity[0] == 1))
01513             dx = fabs(dx) - 2.*xmid;
01514
01515         if ((fabs(dy) > ymid) && (domain->periodicity[1] == 1))
01516             dy = fabs(dy) - 2.*ymid;
01517
01518         if ((fabs(dz) > zmid) && (domain->periodicity[2] == 1))
01519             dz = fabs(dz) - 2.*zmid;
01520
01521         rsq = dx*dx + dy*dy + dz*dz;
01522
01523         if (rsq > cutoff)
01524             continue;
01525
01526         // if not part of i's global_neighbor2 list - add to phi_old
01527         if (std::find(global_neighbors.i.begin(), global_neighbors.i.end(), k) ==
01528             global_neighbors.i.end())
01529         {
01529             phi_old.push_back(array_coordinates());
01530             phi_old[phi_old.count][0] = k;

```

```

01531         phi_old[phi_old.count][1] = lattice[k.local.second]->darray[1][
k.local.first];
01532
01533         phi_old.count++;
01534     }
01535 }
01536 }
01537 return old_eng;
01538 }
01539 else if (flag == 1) // find energy of new state and restore phis
01540 {
01541     eng += old_eng;
01542
01543     for (int kk = 0; kk < phi_old.count; kk++)
01544     {
01545         eng -= phi_old[kk][1];
01546         // find new energy contribution from that site
01547         int k = phi_old[kk][0];
01548         pair_int k_local = global_to_grain(k);
01549         phi_old[kk][2] = pair->energy(k_local.first, k_local.second,
lattice[k_local.second]->num_global_neighbors, lattice[k_local.second]->global_neighbors,
lattice[k_local.second]->coordinates, lattice[k_local.second]->iarray[0],
lattice[k_local.second]->darray[0], lattice[k_local.second]->darray[1]);
        // store the new energy
01550         // note: pair_energy is called instead of site_energy so that the phi update
01551         // is done automatically; if type = 0, site_energy will return 0
01552         // without updating phi
01553         eng += phi_old[kk][2];
01554         // restore the value for the phis after calculating eng
01555         lattice[k_local.second]->darray[1][k_local.first] = phi_old[kk][1];
01556     }
01557 }
01558 else if (flag == 2) // apply the change to phi
01559 {
01560     eng += old_eng; // eng starts off with having the same value as old_eng
01561     // the sites that need their energies recalculated are already stored
01562     // in phi_old[kk][0]
01563
01564     for (int kk = 0; kk < phi_old.count; kk++)
01565     {
01566         // find contribution from sites in phi_old and subtract it from eng
01567         eng -= phi_old[kk][1];
01568         // add the new energy when the change is accepted
01569         int k = phi_old[kk][0];
01570         pair_int k_local = global_to_grain(k);
01571         lattice[k_local.second]->darray[1][k_local.first] = phi_old[kk][2];
01572         eng += phi_old[kk][2]; // add new contribution
01573     }
01574 }
01575 return eng;
01576 }

```

void AppEAM::update_dep_flag (int *grain*) [private]

Updates dep_flag after an event is accepted

Parameters

<i>grain</i>	Grain ID that is being checked
--------------	--------------------------------

Updates `dep_flag` for all active sites in the grain and update the deposition site and dissolution site counts.

Possible values of `dep_flag` are: 0 (not an active site), 1 (available for deposition), 2 (available for dissolution), -1 (occupied, the site is at the edge of the grain) and -2 (unoccupied, the site is at the edge of the grain)

```
01049 {
01050     vec_int& type = lattice[grain]->iarray[0];
01051     vec_int& coordnum = lattice[grain]->iarray[2];
01052     vec_int& dep_flag = lattice[grain]->iarray[3];
01053
01054     vec_coordinates& coordinates = lattice[grain]->coordinates;
01055
01056     int diss_old = diss_sites_count_grain[grain];
01057     int dep_old = dep_sites_count_grain[grain]; // store old value
01058
01059     double min_dist = (lattice[grain]->next_site)*((lattice[grain]->latconst)/1.01);
01060     double max_dist_x = domain->boxhi[0] - (lattice[grain]->next_site)*
        ((lattice[grain]->latconst)/1.01);
01061     double max_dist_y = domain->boxhi[1] - (lattice[grain]->next_site)*
        ((lattice[grain]->latconst)/1.01);
01062     double max_dist_z = domain->boxhi[2] - (lattice[grain]->next_site)*
        ((lattice[grain]->latconst)/1.01);
01063
01064     // resets dep_sites_count_grain
01065     dep_sites_count_grain[grain] = 0;
01066     diss_sites_count_grain[grain] = 0;
01067
01068     for (int ii = 0; ii < active_sites[grain].size(); ii++)
01069     {
01070         int i = active_sites[grain][ii];
01071
01072         // if coordnum != 12 and 0, vacant, not in proximity of another grain, site is
01073         // available for deposition
01074         if ((type[i] == 0) && (coordnum[i] != 12) && (coordnum[i] != 0)
01075             && (dep_flag[i] >= 0))
01076             dep_flag[i] = 1; // if possible deposition site, change the flag to 1
01077         // if site is occupied, has coordnum < 10 - it can undergo dissolution
01078         // the condition in coordnum and determine_direction is to ensure that it is
01079         // at the topmost layer in a particular plane
01080         else if ((coordnum[i] < 10) && (type[i] == 1) && (coordinates[i][0] > min_dist)
01081             && (coordinates[i][0] < max_dist_x) && (coordinates[i][1] > min_dist)
01082             && (coordinates[i][1] < max_dist_y) && (coordinates[i][2] > min_dist)
01083             && (coordinates[i][2] < max_dist_z) && (!edge_check(i,grain))
01084             && ((determine_direction(i,grain) != -1) || (dep_flag[i] >= 0)))
01085             // edge sites are excluded to prevent weird things from happening to the domain
01086             dep_flag[i] = 2; // possible dissolution site, change flag to 2
01087         else
01088         {
01089             if (dep_flag[i] >= 0)
```

```

01090     dep_flag[i] = 0; // else, dep_flag = 0
01091   }
01092 }
01093 }
01094
01095 // sum over all sites - doing this in the loop was not working for some reason
01096 for (int ii = 0; ii < active_sites[grain].size(); ii++)
01097 {
01098   int i = active_sites[grain][ii];
01099   if ((dep_flag[i] == 1) && (type[i] == 0))
01100     dep_sites_count_grain[grain]++; // update the sum
01101   else if ((dep_flag[i] == 2) && (type[i] == 1))
01102     diss_sites_count_grain[grain]++; // update the sum
01103 }
01104 }
01105
01106 diss_sites_count += (diss_sites_count_grain[grain] - diss_old);
01107 dep_sites_count += (dep_sites_count_grain[grain] - dep_old); // add new value
01108 }

```

void AppEAM::update_status (int *i*, int *grain*, int *flag*) [private]

Checks whether the active site *i* is at the edge of existing lattice sites. Updates the status of site *i* and its nearest neighbors in the `active_sites` vector

Parameters

<i>i</i>	Local index of site <i>i</i>
<i>grain</i>	Grain ID of site <i>i</i>
<i>flag</i>	Flag indicating whether function is called in <code>site_event()</code> or not

Calls `check_box` and does the necessary update for AppEAM-specific data structures. Updates `active_sites` with the new status of *i* and its neighbors.

```

00841 {
00842   int N_old = lattice[grain]->N;
00843   vec_coordinates& coordinates = lattice[grain]->coordinates;
00844   vec_int& num_neighbors = lattice[grain]->num_neighbors;
00845   vec_vec_int& neighbors = lattice[grain]->neighbors;
00846   vec_int& coordnum = lattice[grain]->iarray[2];
00847   vec_int& dep_flag = lattice[grain]->iarray[3];
00848
00849   double x_max = domain->boxhi[0];
00850   double y_max = domain->boxhi[1];
00851   double z_max = domain->boxhi[2];
00852
00853   double x_loc, y_loc, z_loc;
00854
00855   matrix& inv_rot_mat = lattice[grain]->inv_rot_mat;
00856   array_coordinates& trans_mat = lattice[grain]->trans_mat;
00857

```

```

00858 vec_int& type = lattice[grain]->iarray[0];
00859 vec_int& grainid = lattice[grain]->iarray[1];
00860
00861 // find where i is in the active sites list
00862 auto loc = std::find(active_sites[grain].begin(), active_sites[grain].end(), i);
00863
00864 // max distance away from the box boundary to be considered an edge site
00865 double max_dist = (lattice[grain]->next_site)*(lattice[grain]->latconst);
00866
00867 // if not in the list and not at the edge, update active_sites
00868 if (loc == active_sites[grain].end())
00869 {
00870     if ((coordnum[i] != 12) && (coordnum[i] != 0))
00871     {
00872         active_sites[grain].push_back(i);
00873     }
00874     for (int mm = 0; mm < num_neighbors[i]; mm++)
00875     {
00876         int m = neighbors[i][mm];
00877
00878         // condition for an active site
00879         if ((coordnum[m] != 12) && (coordnum[m] != 0)
00880             && (!active_sites_check(m, grain)))
00881         {
00882             active_sites[grain].push_back(m);
00883         }
00884         else if (((coordnum[m] == 12) || (coordnum[m] == 0))
00885             && (active_sites_check(m, grain)))
00886         {
00887             auto loc2 = std::find(active_sites[grain].begin(), active_sites[grain].end(), m);
00888             active_sites[grain].erase(loc2);
00889             dep_flag[m] = 0;
00890         }
00891     }
00892 }
00893 return;
00894 }
00895 else
00896 {
00897     // check if i is no longer an active site
00898     if ((coordnum[i] == 12) || (coordnum[i] == 0))
00899     {
00900         active_sites[grain].erase(loc);
00901         dep_flag[i] = 0;
00902     }
00903
00904     // check its neighbors too
00905     for (int mm = 0; mm < num_neighbors[i]; mm++)
00906     {
00907         int m = neighbors[i][mm];
00908
00909         if ((coordnum[m] != 12) && (coordnum[m] != 0)
00910             && (!active_sites_check(m, grain)))
00911         {
00912             active_sites[grain].push_back(m);
00913         }
00914         else if (((coordnum[m] == 12) || (coordnum[m] == 0))

```

```

00915     && (active_sites_check(m, grain)))
00916     {
00917         auto loc2 = std::find(active_sites[grain].begin(), active_sites[grain].end(), m);
00918         active_sites[grain].erase(loc2);
00919         dep_flag[m] = 0;
00920     }
00921 }
00922 }
00923
00924 // if site is not at the edge, then check whether it needs to grow or not
00925 auto loc2 = std::find(neighbors[i].begin(), neighbors[i].end(), -1);
00926
00927 if ((loc2 != neighbors[i].end())
00928     && (fabs(coordinates[i][0]) > max_dist)
00929     && (fabs(coordinates[i][0] - x_max) >= max_dist)
00930     && (fabs(coordinates[i][1]) > max_dist)
00931     && (fabs(coordinates[i][1] - y_max) >= max_dist)
00932     && (fabs(coordinates[i][2]) > max_dist)
00933     && (fabs(coordinates[i][2] - z_max) >= max_dist)
00934     && (loc != active_sites[grain].end()))
00935     // if one of its neighbors = -1, grow the lattice
00936     {
00937         int grow = update_grain(i, grain); // calls check_grain in app.lattice to check
00938         // if we did grow the grain the number of sites would have increased
00939         if (grow)
00940         {
00941             std::cout << "Updating propensity...";
00942
00943             for (int m = N_old; m < lattice[grain]->N; m++)
00944             {
00945                 // update all the arrays, no need to update energy
00946                 // and type since the new sites start out as unoccupied
00947                 grainid[m] = grain;
00948                 coord_update(m, grain);
00949
00950                 // check the status of the new sites
00951                 if ((coordnum[m] != 12) && (coordnum[m] != 0)
00952                     && (!active_sites_check(m, grain)))
00953                 {
00954                     active_sites[grain].push_back(m);
00955                 }
00956                 else if ((coordnum[m] == 12) || (coordnum[m] == 0))
00957                     && (active_sites_check(m, grain))
00958                 {
00959                     auto loc2 = std::find(active_sites[grain].begin(), active_sites[grain].end(), m);
00960                     active_sites[grain].erase(loc2);
00961                     dep_flag[m] = 0;
00962                 }
00963             }
00964
00965             for (int m = 0; m < lattice_count; m++)
00966                 check_grain_distance(m);
00967
00968             for (int m = 0; m < lattice_count; m++)
00969                 update_dep_flag(m);
00970
00971             dep_diss_prob.resize(N_total, vec_double(4, 0.));

```

```

00972 // if called from site.event(), need to extend the propensity
00973 // vector to accommodate the new sites and update existing propensities of
00974 // active sites
00975 if (flag == 1)
00976 {
00977     for (int m = N_old; m < lattice[grain]->N; m++)
00978         propensity.push_back(site.propensity(grain_to_global(std::make_pair(m, grain))));
00979
00980     for (int n = 0; n < active_sites[grain].size(); n++)
00981         site.propensity(grain_to_global(std::make_pair(active_sites[grain][n], grain)));
00982
00983     solve->resize(N_total, propensity); // resize the propensity bin
00984 }
00985
00986 std::cout << " done" << std::endl;
00987
00988 }
00989
00990 // check if i is no longer an active site
00991 if ((coordnum[i] == 12) || (coordnum[i] == 0))
00992 {
00993     active_sites[grain].erase(loc);
00994     dep_flag[i] = 0;
00995 }
00996
00997 // check its neighbors too
00998 for (int mm = 0; mm < num_neighbors[i]; mm++)
00999 {
01000     int m = neighbors[i][mm];
01001
01002     if ((coordnum[m] != 12) && (coordnum[m] != 0)
01003         && (!active_sites_check(m, grain)))
01004     {
01005         active_sites[grain].push_back(m);
01006     }
01007     else if (((coordnum[m] == 12) || (coordnum[m] == 0))
01008             && (active_sites_check(m, grain)))
01009     {
01010         auto loc2 = std::find(active_sites[grain].begin(), active_sites[grain].end(), m);
01011         active_sites[grain].erase(loc2);
01012         dep_flag[m] = 0;
01013     }
01014 }
01015 }
01016 }

```

Member Data Documentation

double SPPARKS_NS::AppEAM::alpha_a [private]

Transfer coefficient for anodic reaction

double SPPARKS_NS::AppEAM::alpha_c [private]

Transfer coefficient for cathodic reaction

double SPPARKS_NS::AppEAM::charge [private]

Elementary charge (C)

int SPPARKS_NS::AppEAM::count [private]

Number of sites deposited

vec_vec_double SPPARKS_NS::AppEAM::dep_diss_prob [private]

Stores deposition and dissolution propensity contributions - used in scaling; columns: dep when pulse is on, dep when pulse is off, diss when pulse is on, diss when pulse is off

int SPPARKS_NS::AppEAM::dep_mode [private]

Deposition mode (0 galvanostatic, 1 potentiostatic)

vec_int SPPARKS_NS::AppEAM::dep_sites [private]

List of sites whose propensities need to be scaled (deposition)

int SPPARKS_NS::AppEAM::dep_sites_count [private]

Total number of possible deposition sites

vec_int SPPARKS_NS::AppEAM::dep_sites_count_grain [private]

Sum of dep_flag of active sites in each grain

vec_int_array_2 SPPARKS_NS::AppEAM::diff_sites [private]

A $n \times 2$ vector of possible diffusion sites and the type of diffusion

vec_int SPPARKS_NS::AppEAM::diss_sites [private]

List of sites whose propensities need to be scaled (dissolution)

int SPPARKS_NS::AppEAM::diss_sites_count [private]

Total number of possible dissolution sites

vec_int SPPARKS_NS::AppEAM::diss_sites_count_grain [private]

Number of possible dissolution sites in each grain

double SPPARKS_NS::AppEAM::Ed [private]

Energy barrier for hopping diffusion

double SPPARKS_NS::AppEAM::Ed_boundary [private]

Energy barrier for diffusion along grain boundaries

double SPPARKS_NS::AppEAM::Ed_exch [private]

Energy barrier for atom exchange diffusion

double SPPARKS_NS::AppEAM::Ed_grain [private]

Energy barrier for diffusion across grain boundaries

double SPPARKS_NS::AppEAM::Ed_step [private]

Energy barrier for step-edge atom exchange diffusion

double SPPARKS_NS::AppEAM::eta [private]
Overpotential (V)

double SPPARKS_NS::AppEAM::i0 [private]
Exchange current density (pA/nm²)

double SPPARKS_NS::AppEAM::i_a_dep [private]
Deposition current density during oxidation (pA/nm²)

double SPPARKS_NS::AppEAM::i_a_diss [private]
Dissolution current density during oxidation (pA/nm²)

double SPPARKS_NS::AppEAM::i_dep [private]
Deposition current density (pA/nm²)

double SPPARKS_NS::AppEAM::i_diss [private]
Dissolution current density (pA/nm²)

double SPPARKS_NS::AppEAM::max_eng [private]
Max value of energy at a site at $t = 0$

int SPPARKS_NS::AppEAM::n_atomexch [private]
Number of atom exchange diffusion events occurred

int SPPARKS_NS::AppEAM::n_boundary [private]
Number of diffusion events along grain boundaries

int SPPARKS_NS::AppEAM::n_diss [private]

Number of sites removed

int SPPARKS_NS::AppEAM::n_grain [private]

Number of diffusion events across a grain boundary

int SPPARKS_NS::AppEAM::n_hop [private]

Number of hopping diffusion events occurred

int SPPARKS_NS::AppEAM::n_max [private]

Maximum number of sites deposited

int SPPARKS_NS::AppEAM::n_step [private]

Number of step-edge atom exchange diffusion events occurred

double SPPARKS_NS::AppEAM::off_dt [private]

Pulse off time

double SPPARKS_NS::AppEAM::old_eng [private]

Total energy of affected sites before event occurs

double SPPARKS_NS::AppEAM::on_dt [private]

Pulse on time

double SPPARKS_NS::AppEAM::ox_rate [private]

Overpotential during 'off' time in pulse-reverse (V)

PairEAM* SPPARKS_NS::AppEAM::pair [private]

vec_coordinates SPPARKS_NS::AppEAM::phi_old [private]

A n x 3 vector of site indices, energy, new energy

int SPPARKS_NS::AppEAM::phi_old_count [private]

Number of rows used in phi_old

double SPPARKS_NS::AppEAM::polish_height [private]

Height to polish to (Angstroms)

double SPPARKS_NS::AppEAM::prev_time [private]

Previous time step

int SPPARKS_NS::AppEAM::pulse [private]

Flag to indicate pulse plating

int SPPARKS_NS::AppEAM::pulse_on [private]

Pulse on/off

double SPPARKS_NS::AppEAM::scale_dep_off [private]

Scaling parameter for propensity when deposition is off

double SPPARKS_NS::AppEAM::scale_dep_on [private]

Scaling parameter for propensity when deposition is on

double SPPARKS_NS::AppEAM::scale_diss_off [private]

Scaling parameter for propensity when dissolution is off

double SPPARKS_NS::AppEAM::scale_diss_on [private]

Scaling parameter for propensity when dissolution is on

double SPPARKS_NS::AppEAM::seed_frac [private]

Seed layer occupancy fraction

int SPPARKS_NS::AppEAM::seed_n [private]

Number of sites in seed layer

double SPPARKS_NS::AppEAM::seedlayer_size [private]

Height of seed layer (Angstroms)

vec_int SPPARKS_NS::AppEAM::sites [private]

Vector of sites whose propensity needed updating

double SPPARKS_NS::AppEAM::v_boundary [private]

Frequency factor for diffusion along grain boundaries

double SPPARKS_NS::AppEAM::v_d [private]

Frequency factor for hopping diffusion

double SPPARKS_NS::AppEAM::v_exch [private]

Frequency factor for atom exchange diffusion

double SPPARKS_NS::AppEAM::v_grain [private]

Frequency factor for diffusion across grain boundaries

double SPPARKS_NS::AppEAM::v_step [private]

Frequency factor for step-edge atom exchange diffusion

double SPPARKS_NS::AppEAM::z_me [private]

Number of electrons transferred in reduction reaction

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