## A Level-Set Method for Self-Organized Pattern Formation during Heteroepitaxial Growth

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Motivation: strain induced ordering in experiments



Goal: Develop a kinetic model that includes strain!

## Outline of this Talk

- Introduction
- The level-set method for epitaxial growth
- Spatially varying potential energy surface (due to surface defects, reconstructions, ...)
- Our elastic model
- Ordering in the submonolayer growth regime
- Ordering of stacked quantum dots

## Physical Processes During Epitaxial Growth



Atomic Motion	Time Scale ~ 10 <sup>-13</sup> seconds	Length Scale: Ångstrom
Island Growth	Time Scale ~ seconds	Length Scale: Microns

## Hierarchy of Theoretical Approaches



## KMC Simulation of a Cubic, Solid-on-Solid Model



- Parameters that can be calculated from first principles (e.g., DFT)
- Completely stochastic approach

## KMC Simulations: Effect of Nearest Neighbor Bond EN

### Large $E_N$ :



#### More Detailed KMC model



Kopatzki et al., Surf.Sci. 284 (1993) F. Grosse et al. PRL 89 (2002) Hwang et al., PRL 67 (1991)

## Scaling of Island Size Distribution Function from KMC

#### Scaling form for island densities N<sub>s</sub>:

![](_page_6_Figure_2.jpeg)

 $\Theta$ : Coverage

s<sub>av</sub>: Average island size

KMC Simulation vs. Experiment [(Fe/Fe(100); Stroscio et al., 1993]

![](_page_6_Figure_6.jpeg)

 $\bullet$  KMC reproduces scaling with D/F and coverage Q in agreement with experiment

• Scaling function depends only on degree of reversibility

Ratsch, Smilauer, Zangwill, Vvedensky, Phys. Rev. Lett., 1994; Surf. Sci. Lett., 1995

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## The challenge for including strain in a growth model

• Strain calculations for a system of typical size in 2+1 dimensions are expensive (at least seconds, maybe minutes)

- A typical timestep in an atomistic simulation is of order  $10^{-6}$  seconds (which is the inverse of a typical diffusion constant D=10<sup>6</sup>.)
- Need of the order of I million timesteps (or more) to simulate I second

#### Possible solutions to this challenge

I) Don't solve global elastic field at every timestep

- solve it only locally, maybe not even every timestep
- do only occasional global updates.

2) Develop a model where the simulation timestep can be taken much larger, but where still all the microscopic dynamics are retained.

- We have developed a level set method
- Typical timestep in the simulation is of order 10<sup>-2</sup> seconds.

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## The Island Dynamics Model for Epitaxial Growth

![](_page_9_Figure_1.jpeg)

- Treat Islands as continuum in the plane
- Resolve individual atomic layer
- Evolve island boundaries with levelset method
- Treat adatoms as a mean-field quantity (and solve diffusion equation)

## The level set method: schematic

![](_page_10_Figure_1.jpeg)

- Level set function is continuous in plane, but has discrete height resolution
- Adatoms are treated in a mean field picture
- Governing Equation:

$$\frac{\partial \varphi}{\partial t} + v_n \mid \nabla \varphi \mid = 0$$

## The Level Set Method

• Velocity:  $v_n = \mathbf{n} \cdot \mathbf{D}(\nabla \rho)^- - \mathbf{n} \cdot \mathbf{D}(\nabla \rho^+)$ : Adatom  $\rho$  $\mathbf{D} = \mathbf{D}(\mathbf{x}) = \begin{pmatrix} D_{xx}(\mathbf{x}) & 0 \\ \uparrow & 0 & D_{yy}(\mathbf{x}) \end{pmatrix} \text{ is diffusion matrix.}$ concentration **Diffusion in y-direction**  $D_{ii}(\mathbf{x}) \approx \exp(-(E_{trans}(\mathbf{x}) - E_{ad}(\mathbf{x}))/kT)$ Diffusion in x-direction • Diffusion equation:  $\frac{\partial \rho}{\partial t} = F + \nabla \cdot \mathbf{D}(\nabla \rho) - 2 \frac{dN}{dt} + drift$   $\mathsf{drift} \sim D_{xx} \nabla_x E_{ad} + D_{yy} \nabla_y E_{ad}$ Nucleation rate  $\sim D\rho(\mathbf{x}, t)^2$ A typical potential energy surface • Boundary condition:  $\rho = \rho_{eq} \left( D_{det}, \mathbf{X} \right)$ detachment rate - E<sub>trans</sub> Stochastic element needed for nucleation

## A typical level set simulation

t = 0.00

![](_page_12_Figure_2.jpeg)

## Validation by comparison of scaled island size distribution

![](_page_13_Figure_1.jpeg)

Experimental Data for Fe/Fe(001),

Stroscio and Pierce, Phys. Rev. B 49 (1994)

Petersen, Ratsch, Caflisch, Zangwill, Phys. Rev. E 64, 061602 (2001).

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## Assume spatially varying potential energy surface (no strain)

![](_page_15_Picture_1.jpeg)

#### Experiment by Xie et al., UCLA

![](_page_15_Picture_3.jpeg)

#### Interpretation:

Variation of potential energy surface is due to strain, that results from burried defect lines

## Variation of adsorption and transition energy

#### Kinetic limit

![](_page_16_Picture_2.jpeg)

Nucleation in region of fast diffusion

Nucleation in region of slow diffusion (but high adatom concentration), dominated by drift

Nucleation rate ~  $D\rho(\mathbf{x},t)^2$ 

#### Thermodynamic limit

![](_page_16_Figure_7.jpeg)

## Ordering by Cleaved Edge Overgrowth

![](_page_17_Picture_2.jpeg)

![](_page_17_Picture_3.jpeg)

![](_page_17_Figure_4.jpeg)

# Quantum dots grow on top of the AIAs stripes

#### Work of E. Uccelli, G. Abstreiter, et al.

Width of AlAs stripe:

![](_page_17_Picture_8.jpeg)

## Level set simulations

![](_page_18_Picture_1.jpeg)

#### Nucleation rate as function of position for increasing width of AlAs stripe

![](_page_18_Figure_3.jpeg)

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## Include Strain: Calculate Elastic Field at Every Timestep

• Our Model: Write down an atomistic energy density, that includes

• Nearest neighbor springs 
$$E = k(S_{xx}^2 + S_{yy}^2)$$
  
Diagonal springs  $E = k_{diag}(S_{xx} + 2S_{xy} + S_{yy})^2 + k_{diag}(S_{xx} - 2S_{xy} + S_{yy})^2$ 

• This can be related to (and interpreted as) continuum energy density

$$E = \alpha (S_{xx}^{2} + S_{yy}^{2}) + \beta S_{xy}^{2} + \gamma S_{xx} S_{yy}$$

- Minimize energy with respect to all displacements:  $\partial_u E[u] = 0$
- The relevant microscopic parameters at every grid point can then be varied as a function of the local strain.

## How does Strain affect the Parameters in our Model?

Density-functional theory (DFT) has been used to study strain dependence of surface diffusion D

GaAs(100) (a semiconductor) Ag/Ag(111) (a metal) -2.30 Obridge site □ foc site  $\mathsf{E}_{\mathsf{trans}}$ -1.5-2.40Total Energy (eV) -2.50 -2  $\mathsf{E}_{\mathsf{ad}}$ -2.60(a) -2.5-2.700.7 120 O DFT-LDA 100 DEMT Diffusion Barrier (meV) **Energy barrier** 0.6 80 for surface 60 0.5 diffusion 40 (b) 20 0.4 1.05 0.95 1.00 -0.08 - 0.040.04 0.08 0 **Relative Lattice Constant** ε

Ratsch et al. Phys. Rev. B 55, 6750-6753 (1997). E. Penev et al., Phys. Rev. B 64, 085401 (2001).

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## Dimer Dissociation and Detachment for Ag/Ag(100)

Adatom detachment

#### **Dimer dissociation**

![](_page_22_Figure_2.jpeg)

![](_page_22_Picture_3.jpeg)

Preliminary DFT Results suggest decrease of energy barrier for dimer dissociation and adatom detachment upon tensile and compressive strain:

$$D_{\rm det} = D_{\rm det,0} \exp\left(\frac{\Delta E_{Strain}}{k_B T}\right)$$

Tests show that the dependence of  $D_{det}$  is more important for ordering of island sizes, while dependence of D is more important for ordering of location.

## Effect of Strain in the Simulation

![](_page_23_Figure_1.jpeg)

## Effect of Strain in the Simulation

Detachment rate

Morphologies

![](_page_24_Picture_2.jpeg)

Elastic energies

![](_page_24_Picture_4.jpeg)

Top row: Strain=1%

### Bottom row: Strain=5%

![](_page_24_Picture_8.jpeg)

![](_page_24_Picture_9.jpeg)

![](_page_24_Picture_10.jpeg)

•With increasing strain, islands become more regular, because small islands are more likely to break up, and growth of large islands slows down.

#### Adatom concentration

![](_page_24_Picture_13.jpeg)

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## Sharpening of the Scaled Island Size Distribution

Level-set simulation

![](_page_25_Figure_2.jpeg)

D. Leonard, M. Krishnamurthy, S. Fafard, J.L. Merz, and P.M. Petroff, J. Vac. Sci. Tech B 12, 1063 (1994)

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## Simulation of Stacked Quantum Dots

#### Al<sub>x</sub>Ga<sub>1-x</sub>As system

![](_page_27_Picture_2.jpeg)

B. Lita et al., APL **74**, (1999)

Experimental observation: Stacked quantum dots align under certain conditions

Question/goal: can we understand and model this, and make some predictions and suggestions?

## Simulation of Stacked Quantum Dots

![](_page_28_Figure_1.jpeg)

- Growth of islands on substrate without strain (constant diffusion and detachment)
- Fill in capping layer "by hand"
- Calculate strain on top of smooth capping layer
- Modify microscopic parameters for diffusion and detachment) according to strain
- Run growth model

#### Repeat procedure

## Ordering of stacked quantum dots

![](_page_29_Figure_1.jpeg)

 $Al_xGa_{1-x}As$  system

![](_page_29_Figure_3.jpeg)

B. Lita et al., APL 74, (1999)

• Spacing and size of stacked dots becomes more regular

X. Niu, Y.-J. Lee, R.E. Caflisch, and C. Ratsch, Phys. Rev. Lett. 101, 086103 (2008).

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## Simulation of growth of 20 superlayers

![](_page_30_Picture_1.jpeg)

![](_page_30_Picture_2.jpeg)

## Regularization of dot size

![](_page_31_Figure_1.jpeg)

## Ordering of stacked quantum dots (top view)

Growth of stacked quantum dots of In<sub>0.5</sub>Ga<sub>0.5</sub>As/GaAs(100)

![](_page_32_Figure_2.jpeg)

#### V.V. Strel'chuk et al., Semiconductors 41 (2007)

![](_page_33_Figure_1.jpeg)

• We find an optimal thickness of capping layer for ordering

## Nucleation rate as a function of capping layer thickness

![](_page_34_Figure_1.jpeg)

## Conclusions

- We have developed a numerically stable level-set method to model epitaxial growth
- A spatially varying potential energy surface can be exploited to obtain ordered structures.
- It is very efficient to include strain in the model, and solve the elastic equations at every numerical timestep.
- Strain leads to ordering in the submonolayer growth regime
- We model the formation and self organization of stacked quantum dots, and suggest that an optimal thickness exists.