## A Novel Approach To Monte Carlo Sintering Simulation with Anisotropic Grain Growth

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#### Introduction

- Monte Carlo (MC) Potts models are widely used by researchers to simulate grain growth and sintering, weather forecasting, ocean currents, etc.
- Grain Size is an important parameter for porous material properties.
- Most models assume isotropic materials to simplify the problem.
- Anisotropy has a significant effect on grain growth rates and other

### **The Potts Model**

- Structure discretized on lattice of sites.
  - Energy associated with sit
  - Configurations have
     Boltzman Distribution
- Potts Model Features
  - Equilibrium 8 -E(iO)tic $\frac{1}{2}$   $E_{ij}$

1<sup>st</sup> Nearest Neighbors 2<sup>nd</sup> Nearest Neighbors

6

3

7

2

4

5

8

#### **Basic Potts Algorithm** Step 1: Initialize the Lattice Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=1 Plot time=100 Ave. radius= 12.2042 Step 2: Grain Growth 20 - Grain Site changing state 60 Step 3: Pore Migration Adjacent Grain/Pore Pair 100 Transition 120 20 100 40 60 80 Step 4: Vacancy Annihilation

# **Introducing Anisotropy**



Morhac & Morhacova





#### Yang et al. (1995)



Misorientation Angle (0% & 60% of Max) Yu & Esche

#### **Introducing Anisotropy**

Energy Anisotropy is introduced in the Jacobian used to Ampute – Use Wulff Plot for surface energy  $0 \qquad q_i = q_i$ 

$$_{ij} = J_i + J_j - J_b \qquad q$$



Ellipsoidal Wulff Plot



 $q_i$ 

Two Cusp Wulff Plot

#### **Introducing Anisotropy**

 A significant factor affecting anisotropy in the Binding Energy, , is the misorientation between the two grains at the grain boundary.

- This has not yet been implemented in the coded simulation.  $J_{h}$
- Currently assumes constant

# Anisotropic growth

Start with aligned grains to see effects (AR 1,2,10).

# Larger surface energy aspect ratios produce more anisotropy.

Latice is 120 x 120 with 5% pores and 2 MCS steps at start time Asp Ratio=1 Plot time=100 Ave. radius= 12.2042



tice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=2 Plot time=100 Ave. radius= 7.7265



Latice is 120 x 120 with 5% pores and 3 MCS steps at start time Asp Ratio=10 Plot time=100 Ave. radius= 5.9872



## Anisotropic Observations

# Angles are correct (20, 30, & 40 deg.). Poor growth in non-neighbor directions.

Latice is 120 x 120 with 5% pores and 3 MCS steps at start time. Asp Ratio=10 Plot time=40 Ave. radius= 4.3534



Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=40 Ave. radius= 4.4567



Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=40 Ave. radius= 5.0536



#### **Random Orientation**

Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=101 Ave. radius= 5.3682



### Non-neighbor directions

The aspect ratio of the max energy to min energy reduces as orientation moves away from neighbor directions.



Aspect ratio gets smaller off neighbor directions

#### **Anisotropy Discussion**

# Anisotropy is apparentGrain Growth is slower with

Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=1 Plot time=100 Ave. radius= 12.2042



Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=101 Ave. radius= 5.3682



## **Anisotropy Discussion**

# Growth is unaffected by lattice size.

Latice is 120 x 120 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=200 Ave. radius= 5.7374



Latice is 200 x 200 with 5% pores and 2 MCS steps at start time. Asp Ratio=10 Plot time=200 Ave. radius= 6.0826



#### **Anisotropy Discussion**

- Growth is limited to lattice neighbor directions causing an artifact.
- Ideas to improve the artifact.
  - Periodically rotate compact through random U(0,π) angles within the borders, and rotate back before display.
    - Need to conserve mass, porosity, & grain size.

#### **Rotation Issues**

Nearest site - Does not conserve mass. Interpolation - Loses meaning of grain/pore Rotation by Shear, Rotation by Area Map, etc. - Many algorithms, a lot patented None conserve mass, porosity, grain size, etc.



- Rotate in rings
  - Width of rings is adjustable parameter.
- Thicker rings
  - Less angular distortion
  - More radial distortion

#### **Circle Rotation**

- To reduce distortion.
  - Use circular specimen on square lattice.
  - Use ring concept to maintain grain size, porosity, mass, etc. and minimize distortion.

Latice is 80 x 80 with 10% pores and 8 MCS steps at start time. Asp Ratio=10 Plot time=18 Rotation Angle= 0



#### **Circle Rotation**

# To reduce distortion. Use circular specimen on square lattice. Use ring concept to maintain grain

Latice is 80 x 80 with 10% pores and 8 MCS steps at start time.



Latice is 80 x 80 with 10% pores and 8 MCS steps at start time Asp Ratio=10 Plot time=18 Rotation Angle= 0.087266







# Algorithm Ring Analysis

Ring Width is the main parameter.
 – Distortion: Angular, Radial.
 – Standard Deviation of Error.



#### Conclusions

Potts model incorporating mechanisms of sintering with anisotropy achieved.

- Novel approach to solving lattice associated artifact problem.
- New Algorithm for implementing rotation concept.

May provide better understanding of anisotropic affects for many models.

#### **Further Work**

- Incorporate anisotropic grain boundary binding energies based on misorientation angle.
- Quantitative analysis to confirm response consistent with other models and physical experiments.
- Analyze random oriented fine grains with aligned large grains for better understanding of Templated Grain Growth

#### **Thank You!**

## **Questions?**

#### **Analytical Approach**

Soap Froth Models – von Neumann (1952)  $\frac{dA_n}{dt} = \frac{\pi\gamma m}{3}(n-6)$ 

Mean Field Theories Von Neumann Mullins equation

 Hillert (1965) "grains drifting"
 Louat (1974) "grains diffusing"

 Overall:

 Difficult to solve
 Don't capture local grain properties

#### **Computer Simulation**

Two categories
 Deterministic

 Vornoi (Vertex) Methods
 Fullman (1952)

Cocks & Gill (1996)



GILL and COCKS: GRAIN GROWTH--II

#### **Computer Simulation:**

Stochastic – Potts Monte Car – Phase Field Lusk (1999) Kazaryan (2001) -VMC Cleri (2000) Moldovan (2002)



Lusk: 1D order parameter motion

#### Step 1: Initialize the Lattice



#### Step 2: Grain Growth

- Select a site
- Randomly select a new grain state (spin) from neighboring spins.
- Calculate $\Delta E$  for changing the spin.
- Generate random U(0,1) and  $d^{\Delta E/kT}$
- If rand  $\leq e^{-\Delta E/kT}$  change to new spin

#### Step 3: Pore Migration

- Select a pore site with an adjacent grain
- Randomly select a new grain state (spin) from neighboring spins.
- Calculate for changing the grain site to a pore and the pore site to a grain with the new selected spin.
- Generate and m U(0,1) and
   If rand <= change to new</li>

Step 4: Vacancy Annihilation (1)

 Theory from DeHoff (1989)
 Compute Grain Boundary Length
 Compute # attempts
 t L<sub>gb</sub>
 Randomly select a pore site.
 If it is a vacancy, annihilate it

- Step 4: Vacancy Annihilation
   (2)
  - Compute centroid of largest adjacent grain
  - Exchange farthest grain in
  - compact a – Vacancy tł become s grain
  - Grain
     become
     s pore



