

# Simulating Polycrystalline Grain Growth Accurately and Efficiently via Distance Function-Based Diffusion-Generated Motion

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#### **Mullins Model for Grain Growth**

#### Assumptions:

- Interfacial energy  $\psi$  associated with interfaces  $\Gamma$  between grains.
- $\psi = \psi(\mathbf{n}, \phi)$  depends on the normal  $\mathbf{n}$  and misorientation  $\phi$ .

#### Mullins model

The energy  $\mathcal{E}$  of a collection of grains in  $\mathbb{R}^d$  is given by:

$$\mathcal{E} = \sum_{k < \ell} \int_{\Gamma_{k\ell}} \psi(\mathbf{n}_{k\ell}, \phi_{k\ell}) d\mathbf{s}.$$

The  $L^2$  gradient flow on  $\mathcal{E}$  is:

$$\psi_{\mathbf{n}(\Gamma_{k\ell})} = \mu_{k\ell} \sum_{i=1}^{d-1} \left( \frac{\partial^2 \psi(\mathbf{n}_{k\ell}, \phi_{k\ell})}{\partial (\mathbf{p}_{k\ell}^{(i)})^2} \kappa_{k\ell}^{(i)} \right)$$

with interfacial mobility  $\mu_{k\ell}$ , principal curvatures  $\kappa^{(i)}$  in the tangent directions  $\mathbf{p}^{(i)}$ , and  $\psi$  extended to a one-homogenous function on  $\mathbb{R}^d$ .

A natural (Herring) boundary condition along triple lines is enforced. Under the assumption that the mobility of triple lines is infinite, this boundary condition corresponds to the vanishing of forces along the triple line.

#### Unequal Interface Energy Model

#### Simplifications:

- $\mu_{k\ell} \equiv 1.$
- Surface energy independent of normal:  $\psi(\mathbf{n}_{k\ell}, \phi_{k\ell}) = \psi(\phi_{k\ell}) \equiv \psi_{k\ell}$ .

#### Simplified model

Energy:

$$\mathcal{E} = \sum_{k < \ell} \int_{\Gamma_{k\ell}} \psi_{k\ell} dk$$

Dynamics:

 $v_{\mathbf{n}}(\Gamma_{k\ell}) = \psi_{k\ell} \kappa_{k\ell},$ 

 $\sum_{\Gamma_{k\ell}\in\mathrm{TL}}\psi_{k\ell}\mathbf{b}_{k\ell}=\mathbf{0},$ 

where  $\mathbf{b}_{k\ell}$  is orthogonal to  $\mathbf{n}_{k\ell}$  and the tangent to the triple line.

## Numerical Results (Fiber Texture)

• Grains with similar orientations tend to form clusters.



- Significant fraction of low-energy boundaries initially.
- MDF coarsens strongly around 0°.



• Difference between fiber and random texture evolutions attributed to "almost-ideal" nature of random texture (very few interfaces feel energy different that  $\gamma_{\text{max}}$ ).



- Very few low-energy boundaries initially.
- Little evolution of the MDF.



### Basic Crystallography

**Misorientation:**  $\phi_{ij}$ : Magnitude of the smallest rotation bringing the crystal lattice of  $\Sigma_i$  into alignment with that of  $\Sigma_j$ .

#### **Numerical Schemes**

## DFDGM algorithm for additive surface energy

Assume:  $\psi_{k\ell} = \frac{1}{2}(\gamma_k + \gamma_\ell).$ 

Update each collection of grains  $\Xi_k$  for a discrete time step  $\delta t$  by:

- 1. UPDATE: Compute  $A_k = d_k^n * G_{\underline{\gamma_k \delta t}}$ .
- 2. REDISTRIBUTE: Set  $B_k = A_k \sum_{\ell \neq k} A_\ell$ .
- 3. REDISTANCE: Compute  $d_k^{n+1} = \text{Redist}(B_k)$ .
- Redistancing is a standard level set technique which computes signed distance to 0-level set of input.
- Unconditionally stable, with  $O(N\log N)$  complexity.

**Observation:** Arbitrary surface tensions  $\psi_{12}$ ,  $\psi_{13}$ , and  $\psi_{23}$  can be mapped to  $\gamma_{1;23}$ ,  $\gamma_{2;13}$ ,  $\gamma_{3;12}$  so that  $\psi_{12} = \frac{1}{2}(\gamma_{1;23} + \gamma_{2;13})$ , etc., by:

 $\begin{pmatrix} \gamma_{1;23} \\ \gamma_{2;13} \\ \gamma_{3;12} \end{pmatrix} = \begin{pmatrix} 1 & 1 & -1 \\ 1 & -1 & 1 \\ -1 & 1 & 1 \end{pmatrix} \begin{pmatrix} \psi_{12} \\ \psi_{13} \\ \psi_{23} \end{pmatrix}.$ 

This suggests an algorithm for full unequal interface energy model:

### Unequal interface energy algorithm

Fix  $\varepsilon$  and K > 0. Replace UPDATE step above by:

1. UPDATE: For each grid location x, define

 $R(x) = \{k : d_k^n(x) > -\varepsilon\}, \text{ and let } r(x) = \#R(x).$ (a) If  $R(x) = \{j\}, \text{ set } A_j(x) = d_j^n(x).$ (b) If  $R(x) = \{j, k\}, \text{ set } A_j(x) = d_j^n(x) * G_{(\psi_{jk} \delta t)}.$ (c) If  $R(x) = \{j, k, \ell\}, \text{ set } A_j(x) = d_j^n(x) * G_{(\gamma_{j;k\ell} \delta t)}.$ (d) If r(x) > 3,

• For each  $j \in R$ , compute

$$T_j(x) = \frac{1}{\binom{r(x)-1}{2}} \sum_{k,\ell \in R} d_j^n(x) * G_{(\gamma_{j;k\ell} \,\delta t)}.$$

• Compute

$$w_j(x) = \begin{cases} \varepsilon, & T_j(x) < -K \\ \varepsilon + (1 - \varepsilon) \left(\frac{1}{2} + \frac{T_j(x)}{2K}\right), & |T_j(x)| < K \\ 1, & T_j(x) > K. \end{cases}$$
  
• Set  
$$\sum_{k,\ell \in R} w_j w_k w_\ell d_j^n(x) * G_{(\gamma_j;k\ell \delta t)}$$

 $A_j(x) = \frac{\sum_{k,\ell \in R} w_j w_k w_\ell}{\sum_{k,\ell \in R} w_j w_k w_\ell}$ 

• Assertion supported by numerical tests with different surface energy functions  $\gamma(\phi)$ .

## Numerical Results (3D Random Texture)

- Results qualitatively similar to 2D random texture simulation.
- Only 616 grains remain at end of simulation.



• Little evolution of the MDF.



## **Additional Notes**

- Simulations begin with over 600,000 grains in 2D and 64,000 grains in 3D.
- Algorithm is expected to be unconditionally stable.
- Methods which implicity represent interfaces *naturally* allow topological changes to occur without additional user input (in contrast to explicit methods).
- Computational efficiency attained by maintaining a collection of spatially-separated grains in each signed distance function. Only one convolution is performed per collection of grains via the replacement of  $d_k^n * G_{(\gamma_k \delta t)}$  by

$$\frac{\gamma_k(x)}{\gamma^*} \left( G_{\gamma^* \delta t} * d_k^n \right) + \left( 1 - \frac{\gamma_k(x)}{\gamma^*} \right) d_k^n = d_k^n * G_{(\gamma_k \delta t)} + O(t),$$

where  $\gamma^* = \max_j \gamma_j$  and the  $\gamma_k$  are the weights required by the unequal interface energy algorithm.



Fiber texture: All grain orientations share common rotation axis.



Random texture: Rotation axis and angle assigned randomly.

## Surface Energy and Misorientation

Surface energies commonly modeled by Read–Shockley relation:



## MDF and SEDF

- The *misorientation distribution function* (MDF) measures the (areaweighted) proportion of grain boundaries with given misorientation.
- The *surface energy distribution function* (SEDF) is the analogous quantity for surface energies.

#### References

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