

Efficient computation of crystal growth using sharp interface methods

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Outline

- 1 Curvature driven interface motion
- 2 Numerical methods for geometric flows
- 3 The new approach
- 4 Anisotropy
- 5 Stefan problem

Curvature driven interface motion

Issue:

Compute the motion of hypersurfaces where the normal velocity is given in terms of curvature

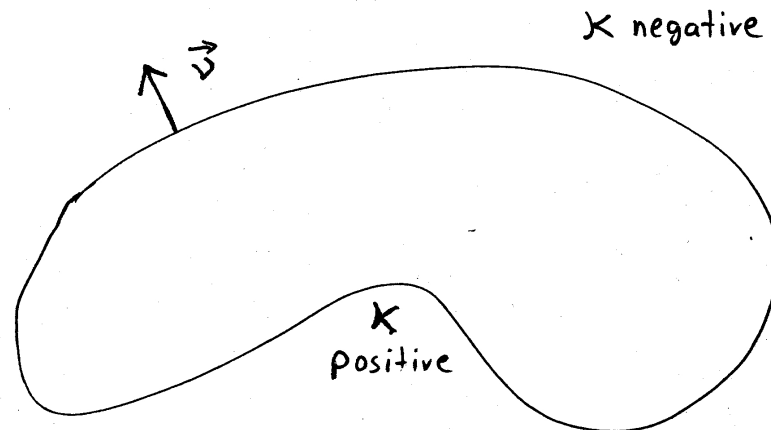
Applications:

| | |
|--------------------|---|
| Materials science | (grain growth, solidification) |
| Epitaxial growth | (surface diffusion) |
| elastic flows | (Willmore flow, elastic rods, biological membranes) |
| general relativity | (positive mass theorem) |
| computer graphics | (image and surface processing) |

Curvature driven interface motion

Notation

$\Gamma = (\Gamma_t)_{t \in [0, T]}$ evolving surface $\vec{\nu}$ unit normal
 \mathcal{V} normal velocity H mean curvature



$\vec{H} = H\vec{\nu}$ mean curvature vector Δ_S surface Laplacian

Curvature driven interface motion

Examples of geometric flows

$$\mathcal{V} = H$$

mean curvature flow

$$\mathcal{V} = f(H)$$

e.g. $\mathcal{V} = -\frac{1}{H}$ inverse mean
curvature flow

$$\mathcal{V} = -\Delta_s H$$

surface diffusion

$$\mathcal{V} = -\Delta_s H - H|\nabla_s \nu|^2 + \frac{1}{2}H^3$$

Willmore flow (elastic flow)

+

anisotropic versions

+

coupling to bulk quantities

Curvature driven interface motion

Properties of the flows

1.) Surface area decreasing

$$\frac{d}{dt} \int_{\Gamma_t} 1 \, d\mathcal{H}^{d-1} \leq 0$$

O.K. for mean curvature flow, surface diffusion

2.) Volume preserving

$$\frac{d}{dt} \text{volume} = \int_{\Gamma_t} \nu \, d\mathcal{H}^{d-1} = - \int_{\Gamma_t} \Delta_s H \, d\mathcal{H}^{d-1} = 0$$

O.K. for surface diffusion

Gauß theorem!

Numerical methods for geometric flows

Numerical methods for mean curvature flow I

$$\mathcal{V} = H$$

| | | | |
|--------------|---|---------------------|--------------------------|
| Approaches | : | Level set methods | (Osher, Sethian, ...) |
| | | Phase field method | (Caginalp, Elliott, ...) |
| | | Graphs | |
| In this talk | : | Parametric approach | |

Numerical methods for mean curvature flow II

Use parametrisation

$$(\rho, t) \mapsto \vec{x}(\rho, t) \in \mathbb{R}^d$$

$\rho \in M$, M reference manifold

$$t \in [0, T]$$

We compute normal velocity as $\mathcal{V} = \vec{x}_t \cdot \vec{\nu}$

Problem: How do we compute mean curvature?

Use parametric approach

Dziuk for the first time discretized

$$\Delta_s \vec{x} = H \vec{\nu}$$

with piecewise linear continuous finite elements
and solves a discrete version of

$$\vec{x}_t = \Delta_s \vec{x} \quad (= H \vec{\nu})$$

to approximate mean curvature flow

Not necessary: Original equation only prescribes normal velocity.

Numerical methods for geometric flows

Review of Results

Many analytical and computational results are known for this approach:

- stability is known
- error estimates ($d = 2$, Dziuk, Deckelnick)
- computations for dendritic growth possible (Schmidt)
- anisotropy can be included (Dziuk, Deckelnick)

Disadvantages

- no generalization to $\mathcal{V} = f(H)$ possible
- generalization to fourth order flows is difficult
- mesh distortions possible

A new approach for curvature driven flows

Idea: Work with two variables (\vec{X}, H) and write the flow as:

$$\mathcal{V} = \vec{X}_t \cdot \vec{\nu} = H, \quad H\vec{\nu} = \Delta_s \vec{X}.$$

A new approach for curvature driven flows

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Numerical discretization:

time steps : $0 = t_0 < t_1 < \dots < t_{n-1} < t_n = T,$
 $\tau_m := t_{m+1} - t_m$

polyhedral surface : $\Gamma^m = \bigcup$ simplices

FE spaces : W_m^h piecewise linear cont. FE over Γ^m

$$V_m^h = [W_m^h]^d$$

Discrete version of the weak formulation:

Solve the discrete version of the weak formulation:

$$\left\langle \frac{\vec{X}^{m+1} - \vec{X}^m}{\tau_m}, \chi \vec{\nu}^m \right\rangle_m^h - \langle H^{m+1}, \chi \rangle_m^h = 0 \quad \forall \chi \in W_m^h$$

$$\langle H^{m+1} \vec{\nu}^m, \vec{\eta} \rangle_m^h + \langle \nabla_s \vec{X}^{m+1}, \nabla_s \vec{\eta} \rangle_m = 0 \quad \forall \vec{\eta} \in V_m^h$$

Here $\langle \cdot, \cdot \rangle_m$ and $\langle \cdot, \cdot \rangle_m^h$ are inner products over Γ^m (using mass lumping).

Evaluate ∇_s using the “old” metric.

How does the mesh behave ?

For $d = 2$ we obtain for the semi-discrete version:

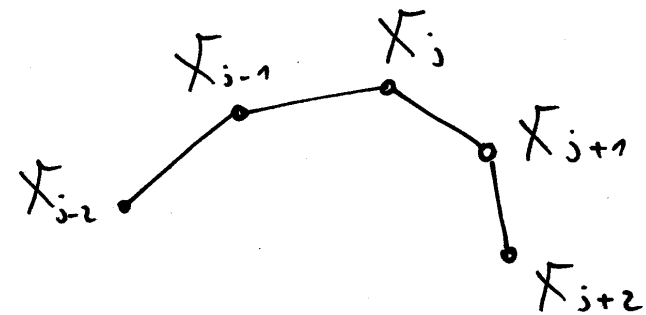
Either

$$|\vec{X}_{j+1} - \vec{X}_j| = |\vec{X}_j - \vec{X}_{j-1}|$$

or

$$(\vec{X}_{j+1} - \vec{X}_j) \parallel (\vec{X}_j - \vec{X}_{j-1})$$

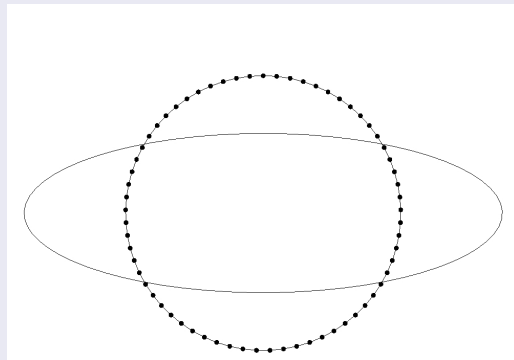
Idea of proof: Test with a suitable approximation of the tangent.



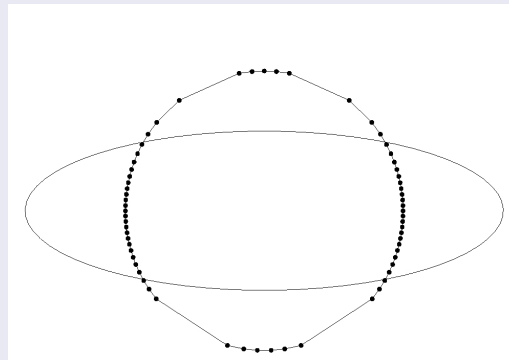
Numerical methods for geometric flows

Implications for the fully discrete scheme

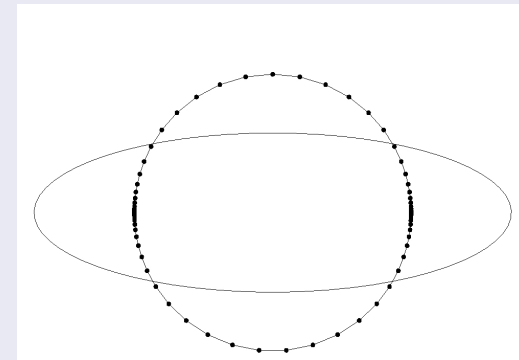
Tendency for equidistribution of mesh points !
 Examples for surface diffusion



Our scheme



Dziuk scheme



Bänsch Morin Nochetto
 scheme

Schemes of Dziuk and Bänsch, Morin, Nochetto
 work well after mesh redistribution !

Our algorithm can be rewritten as:

Find \vec{X}^{m+1} as a solution of (neglect numerical integration)

$$\underbrace{\int_{\Gamma^m} |\nabla_s \vec{X}|^2}_{\text{Dirichlet integral}} + \underbrace{\frac{1}{\tau_m} \int_{\Gamma^m} ((\vec{X} - \vec{X}^m) \cdot \vec{\nu}^m)^2}_{\text{small to higher order for tangential variations}} \rightarrow \min$$

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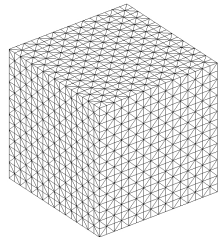
Theory of minimal surfaces:

Minimizing the Dirichlet integral under all possible reparametrizations gives a conformal mapping

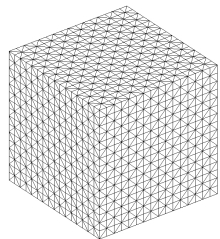
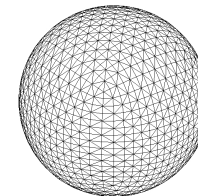
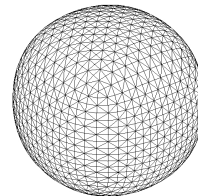
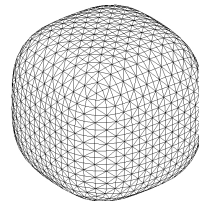
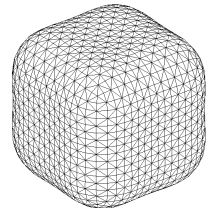
Here: Discrete conformal mapping (cp. [Pinkall](#) + [Polthier](#))

Higher dimensional case

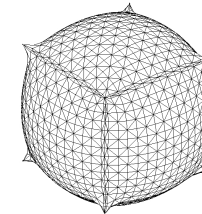
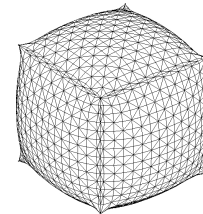
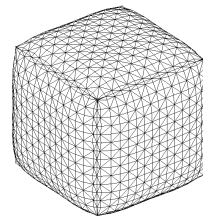
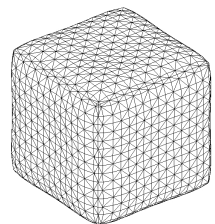
Surface diffusion in 3-d



Our scheme



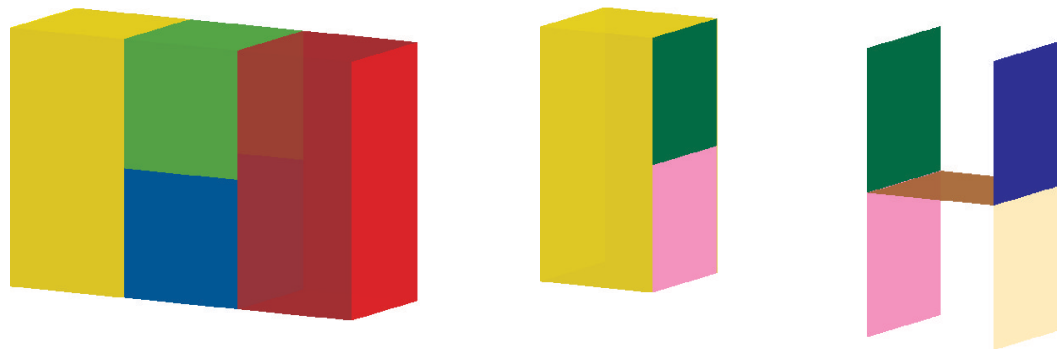
Bänsch, Morin, Nochetto scheme (allowing only velocities in normal direction - similar as Dziuk)



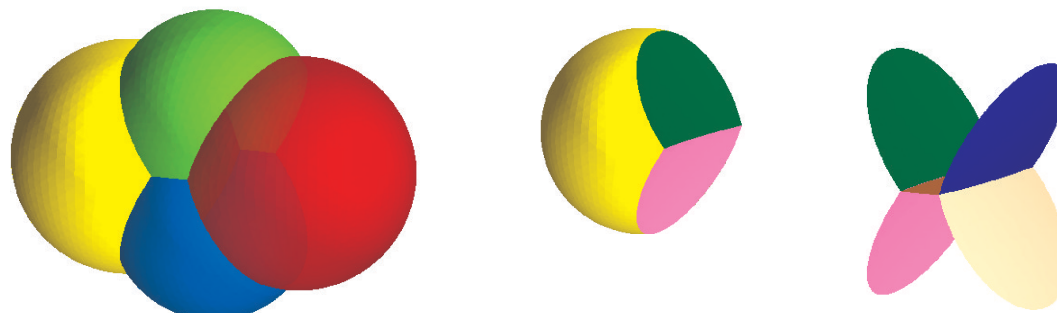
Mesh distortion appears

Triple junction lines

Surface diffusion with triple lines



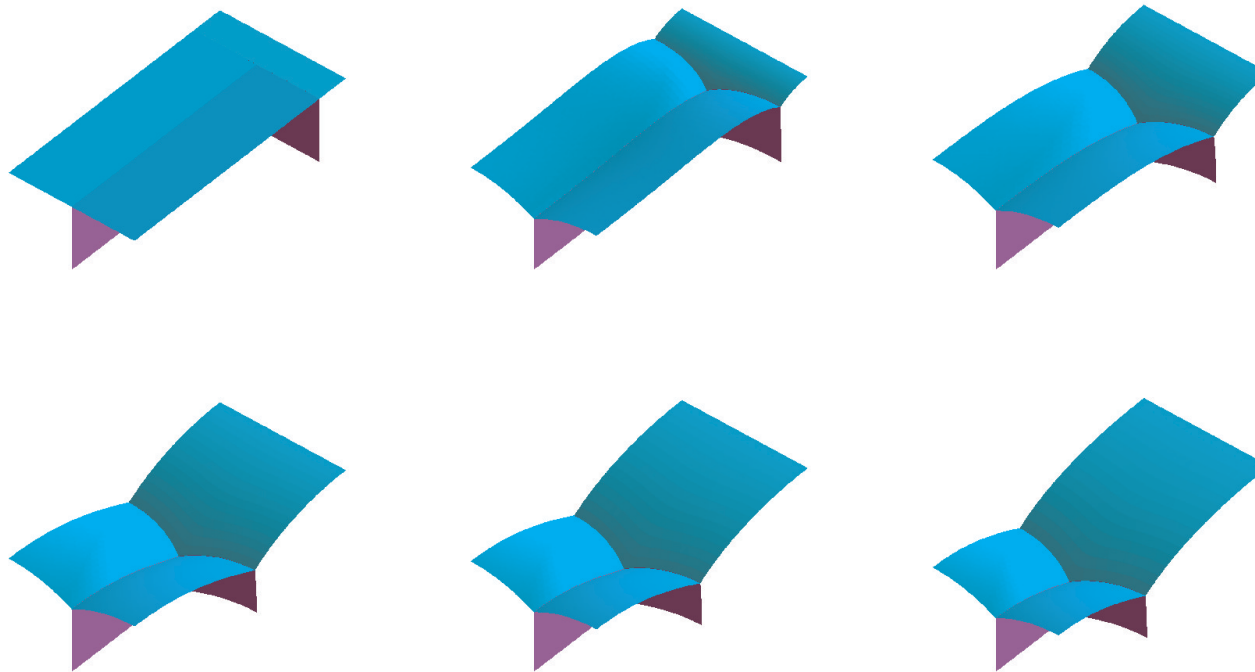
Initial time



Solution at a large time

Coupled Surface diffusion and grain boundary motion

Surface grooves with grain boundaries



Time evolution

How to handle the anisotropy ?

This was a problem in earlier approaches

Problem: Equations are highly nonlinear

It is difficult to obtain stable discretizations

Idea: Use Riemannian structure as much as possible

Central idea

so far: Discretize

$$H \vec{\nu} = \Delta_s \vec{id}$$

Now: Replace standard Euclidean inner product on \mathbb{R}^d by a (space independent) product

$$(\vec{u}, \vec{v})_{\tilde{G}} = \vec{u} \cdot \tilde{G} \vec{v}$$


Ansatz

Define

$\gamma(\vec{\nu})$ = surface element related to $\vec{\nu}^\perp$

$$= \det(\vec{\tau}_i \cdot \tilde{G} \vec{\tau}_j)_{i,j=1}^{d-1}$$

$\tau_1, \dots, \tau_{d-1}$ ONB of $\vec{\nu}^\perp$

 ellipsoidal Wulff shapes

Generalize to ℓ^r -norms of such expressions

$$\gamma(\vec{p}) = \left(\sum_{\ell=1}^L [\gamma_\ell(\vec{p})]^r \right)^{\frac{1}{r}},$$


$\gamma_\ell(\vec{p})$ defined as above with the help of \tilde{G}_ℓ

Do the geometric analysis with respect to the new metric (cf. **Bellettini + Paolini**) to obtain first variation of

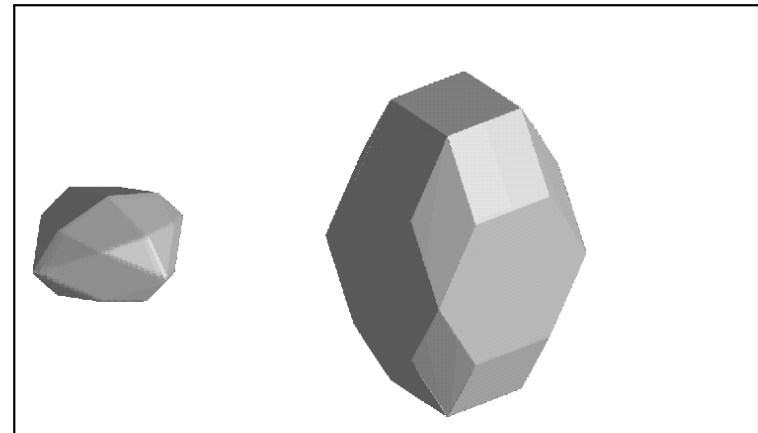
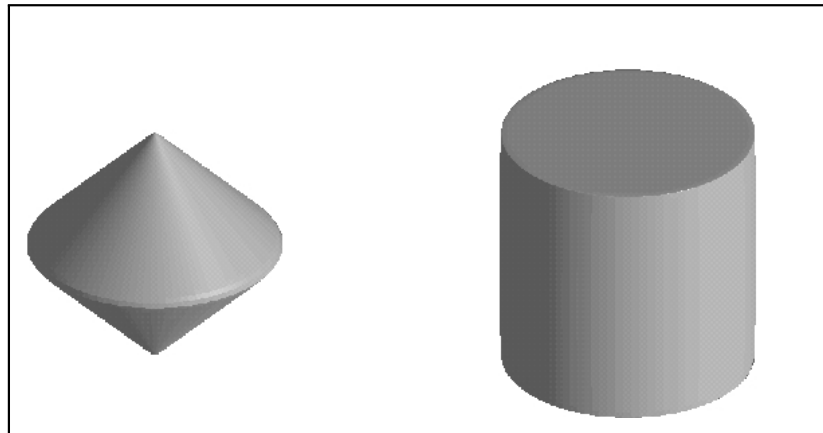
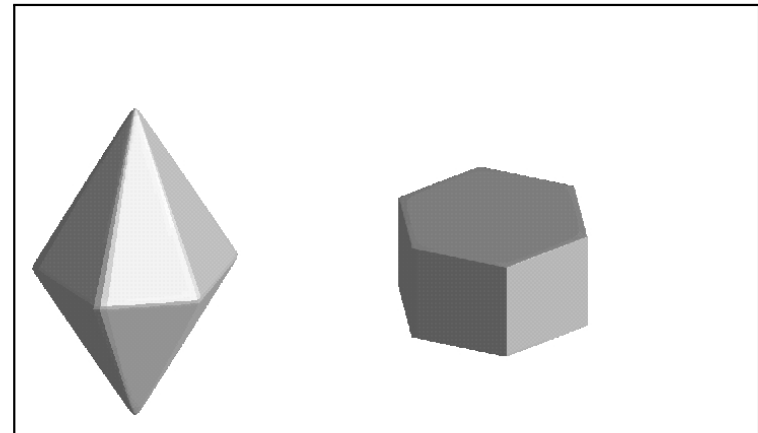
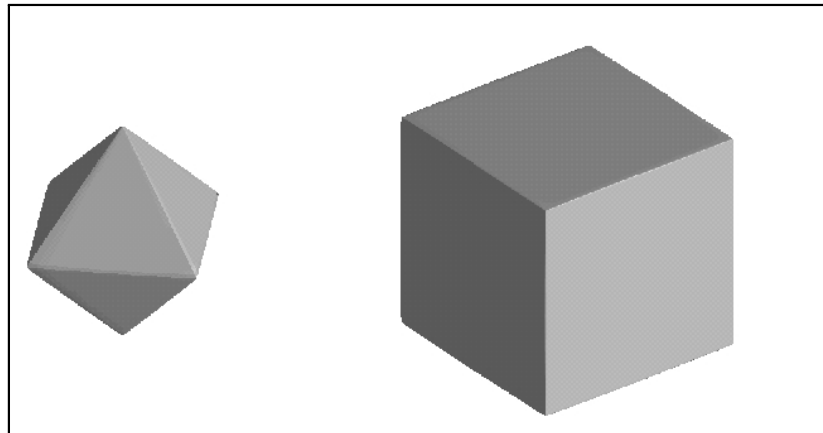
$$\mathcal{F}(\Gamma) = \int_{\Gamma} \gamma(\vec{\nu})$$

We obtain $H_{\gamma} \vec{\nu} = \sum_{\ell=1}^L \gamma_{\ell}(\vec{\nu}) \tilde{G}_{\ell} \nabla_s^{\tilde{G}_{\ell}} \cdot \left[\left[\frac{\gamma_{\ell}(\vec{\nu})}{\gamma(\vec{\nu})} \right]^{r-1} \nabla_s^{\tilde{G}_{\ell}} \text{id} \right].$

$$\int_{\Gamma} H_{\gamma} \vec{\nu} \cdot \vec{\varphi} d\mathcal{H}^{d-1} = - \sum_{\ell=1}^L \int_{\Gamma} \left[\frac{\gamma_{\ell}(\vec{\nu})}{\gamma(\vec{\nu})} \right]^{r-1} (\nabla_s^{\tilde{G}_{\ell}} \text{id}, \nabla_s^{\tilde{G}_{\ell}} \vec{\varphi})_{\tilde{G}_{\ell}} \gamma_{\ell}(\vec{\nu}) d\mathcal{H}^{d-1},$$

 Weak formulation possible

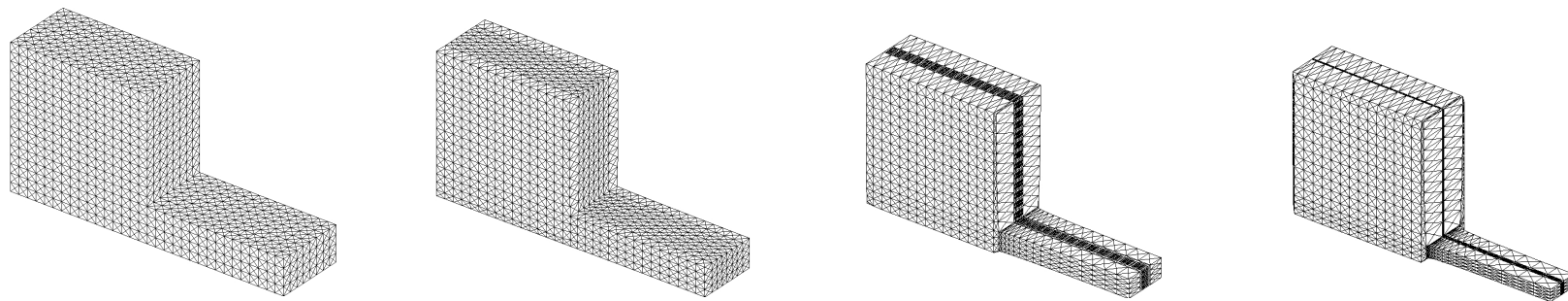
We can handle e.g. the following anisotropies



Frank diagrams (left) and Wulff shapes (right)

Anisotropic geometric evolution equations

Compute facet breaking for crystalline flows

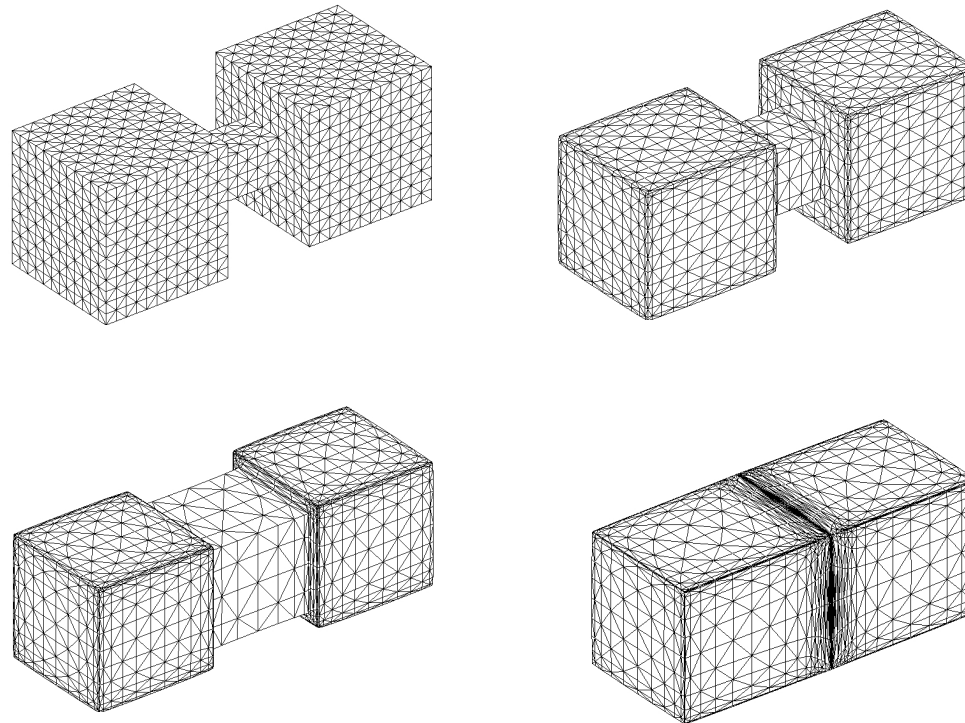


$\vec{X}(t)$ at times $t = 0, 0.1, 0.2, 0.25$

crystalline curvature flow
(facet breaking, cf. Bellettini, Novaga, Paolini)

Anisotropic geometric evolution equations

crystalline surface diffusion

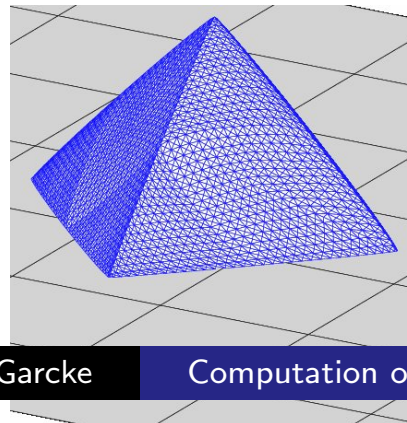
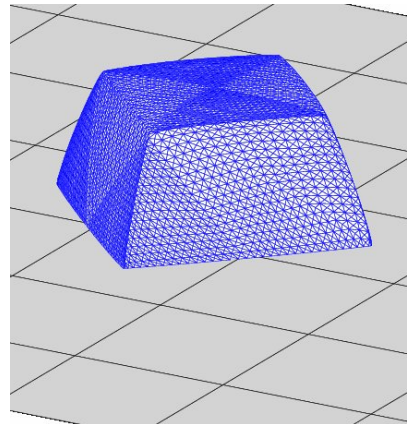
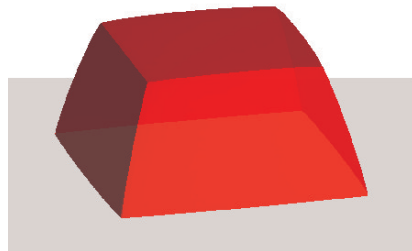


Contact with exterior boundary

Anisotropic surface diffusion with boundary conditions

Initial data: Spherical cap.

Solutions at large times for different anisotropies



Numerical approximation

Stefan problem with kinetic undercooling

| | | | |
|-------------------------------------|-----|----------------------------|--|
| $\partial_t u - \Delta u$ | $=$ | f | in liquid and solid |
| $[\frac{\partial u}{\partial \nu}]$ | $=$ | $-\frac{1}{S} \mathcal{V}$ | Stefan condition on interface Γ |
| $\frac{1}{\beta(\nu)} \mathcal{V}$ | $=$ | $H_\gamma - S u$ | generalized Gibbs–Thomson relation |
| $[\cdot]$ | | | jump across interface |
| S | | | undercooling |
| β | | | kinetic coefficient |

How to approximate the Stefan problem numerically ?

Approaches so far: **A. Schmidt** (1993), **R. Almgren**(1993), ...

Needed: Weak formulation of the Stefan problem

$$(\partial_t u, \phi)_{L^2} + (\nabla u, \nabla \phi) = \int_{\Gamma(t)} (x_t \cdot \nu) \phi d\mathcal{H}^{d-1}$$

$$\int_{\Gamma(t)} \frac{x_t \cdot \nu}{\beta(\nu)} \chi d\mathcal{H}^{d-1} = \int_{\Gamma(t)} [H_\gamma - u] \chi d\mathcal{H}^{d-1}$$

$$\int_{\Gamma(t)} H_\gamma \nu \cdot \eta d\mathcal{H}^{d+1} + \int_{\Gamma(t)} \nabla_s x \cdot \nabla_s \eta = 0$$

for suitable test functions

Approximate

Γ by polyhedral surfaces

u by a bulk FE function

x vector FE–function on a reference polyhedron

H scalar function on reference polyhedron

Stability

Continuous Lyapunov structure (u_D constant)

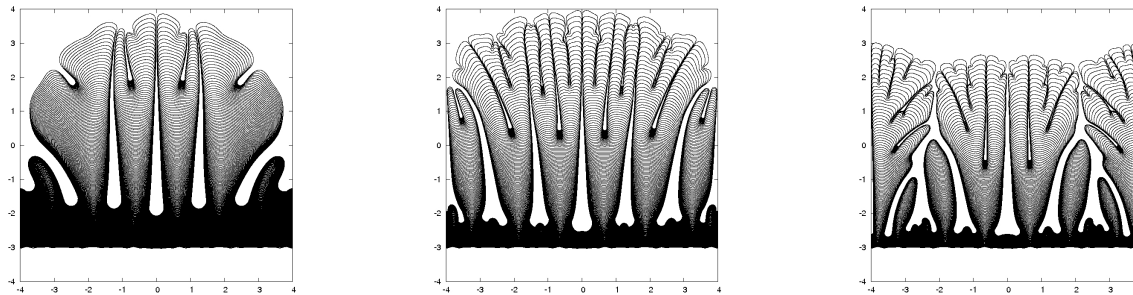
$$\frac{d}{dt} \left(\int_{\Omega} (u - u_D)^2 + \mathcal{F}(\Gamma) + u_D \text{vol}(\Omega_s(t)) \right) + \int_{\Omega} |\nabla u|^2 + \int_{\Omega} \frac{\nu^2}{\beta(\vec{\nu})} ds \leq (f, u - u_D)$$

We obtain a discrete analogue of the above inequality even in the **anisotropic case**

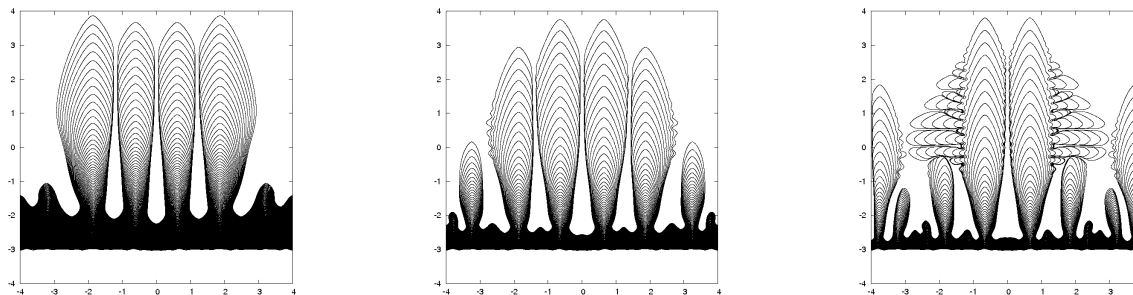
Proof:

- Testing procedure
- Generalize a Lemma of **Bänsch** to estimate surface energy

Mullins Sekerka instability in 2D



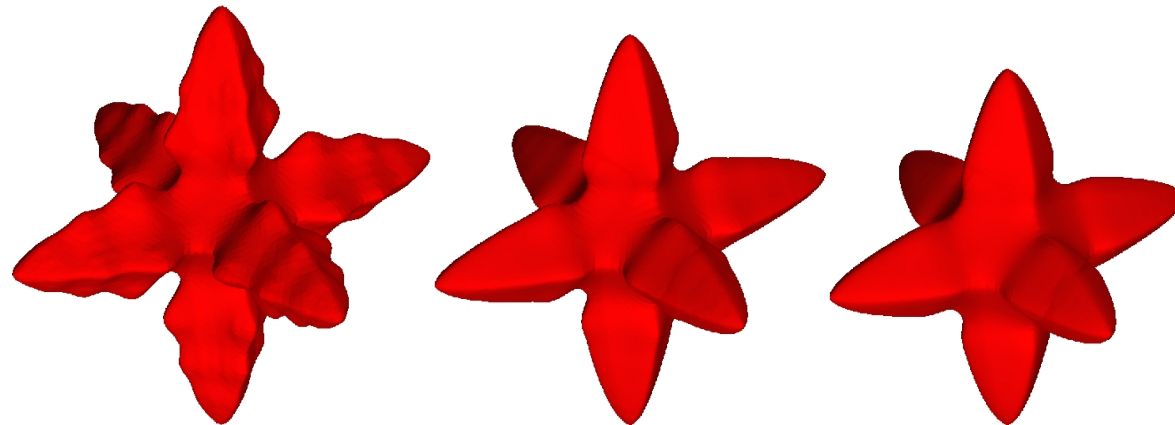
undercooling $\mathcal{S} = 1$, isotropic surface energy 5×10^{-3} , 2×10^{-3} , 10^{-3}



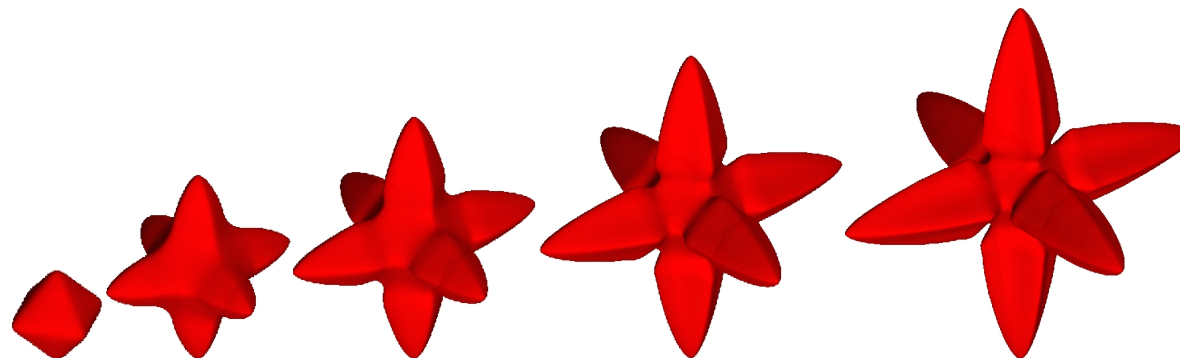
undercooling $\mathcal{S} = 1$, cubic anisotropy with prefactor 5×10^{-3} , 2×10^{-3} , 10^{-3}

Solidification with cubic anisotropy

- Small sphere as initial data



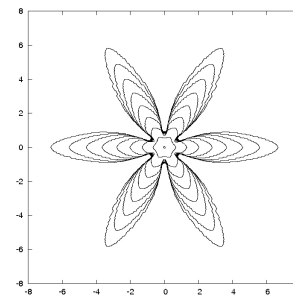
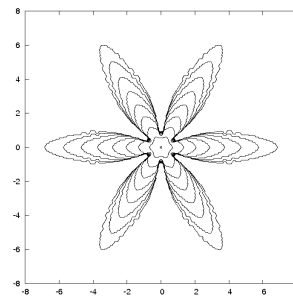
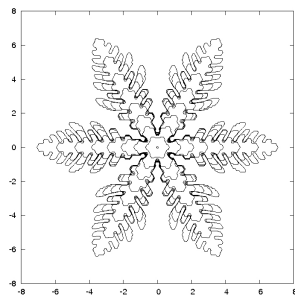
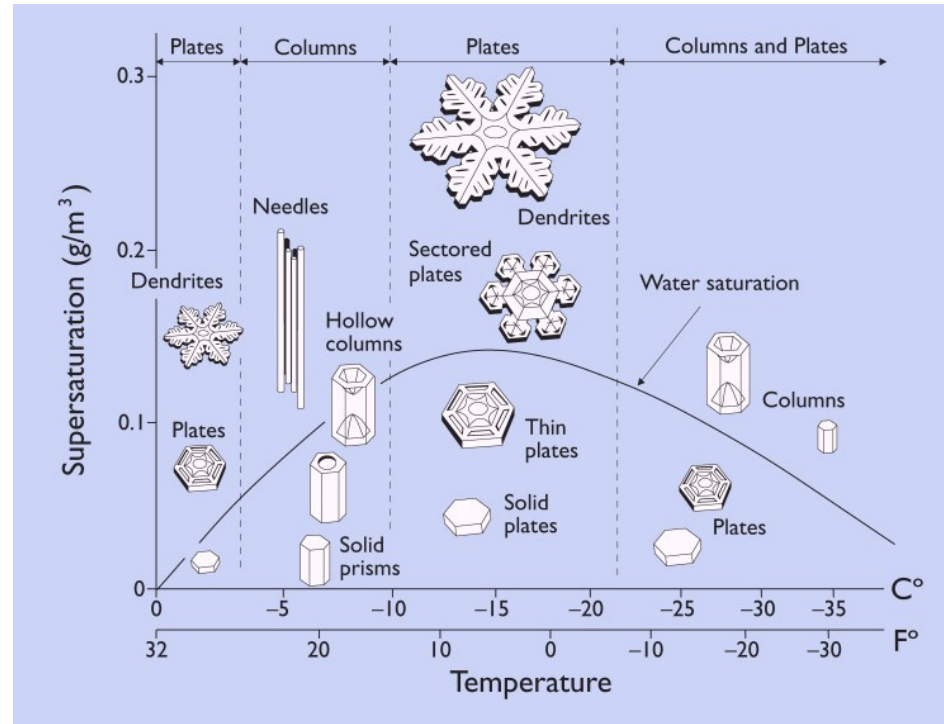
- Computation for different refinements. Oscillations disappear for fine grids



Details of the evolution on finest grid

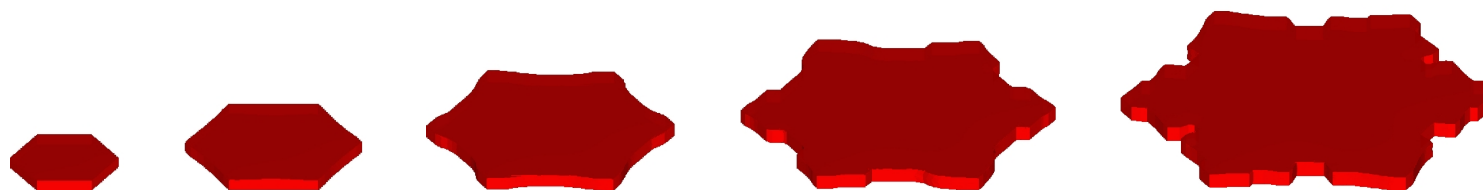
Hexagonal symmetry (snow crystal symmetry)

Morphology diagram of Nakaya

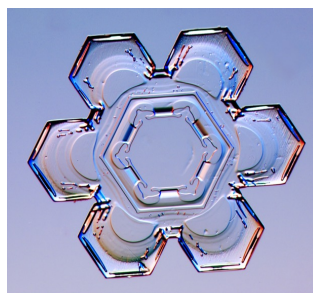


2D-computation

Classical snow crystals

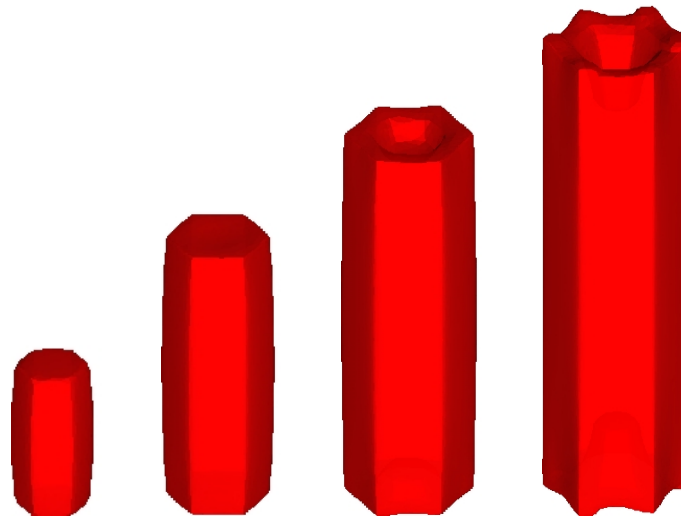


formation of plates



real snowflake (photo due to K. Libbrecht)

Many forms need 3D computations

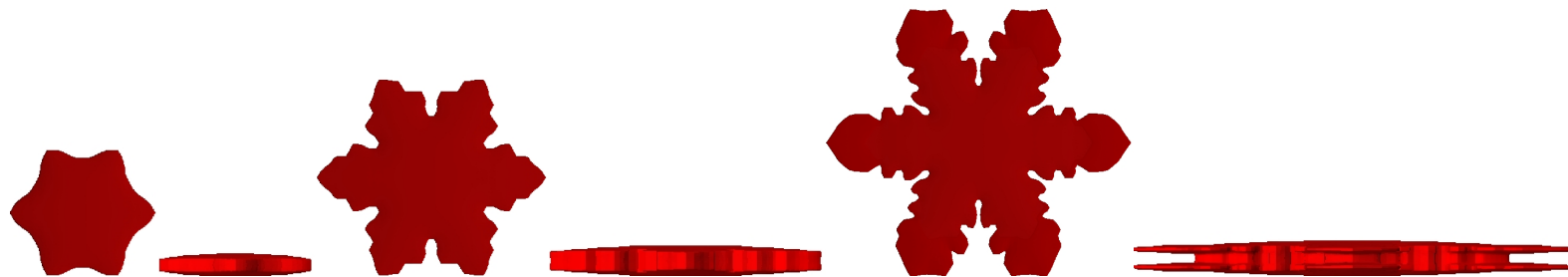


Formation of hollow columns (facet braking)



real snowflake

Another 3D effect



A more pronounced real snowflake

Remarks and Conclusions

- We derived **stable** finite element discretization with **good mesh properties**
(No redistancing of mesh points necessary)
- Crystalline anisotropies can be approximated in a stable and efficient way
- Method is applicable and efficient also for quasi-static variants
(Mullins–Sekerka problem)

$$\begin{aligned} \partial_t u - \Delta u = 0 & \rightsquigarrow -\Delta u = 0 \\ \frac{1}{\beta(\nu)} \mathcal{V} + u = H_\gamma & \rightsquigarrow u = H_\gamma \end{aligned}$$