

# Energy-Driven Pattern Formation

Robert V. Kohn

Courant Institute, NYU

ICM2006, Madrid



**Key insight:** upper bound on coarsening rate is universal.

**Key approach:** two ways to measure length scale: a neg norm ( $L$ ) and perimeter ( $E$ ); linked by interpolation and energy ineqs.

**Generalizes:** to multiple phases, Mullins-Sekerka dynamics, Ostwald ripening, epitaxial growth

**Open questions:** similar results have *not* been shown for motion by curvature, grain growth, or Ginzburg-Landau vortices.

(1) Bounds on coarsening rates

(2) Structure of a cross-tie wall

tools Optimal lower bound via inspired  
integration by parts

work by Alouges, Rivière, & Serfaty, COCV 2002

version here DeSimone, Kohn, Müller & Otto 2005

(3) Pathways of thermally-activated switching

# Cross-tie wall

This is a special type of domain wall seen in “soft,” thin ferromagnets (not too thin!)



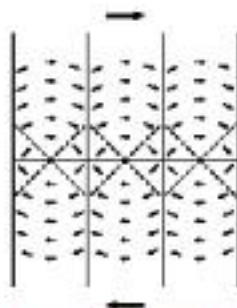
**Question:** Why this particular pattern?

**Answer:** It minimizes the total energy.

**Main steps:**

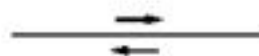
- Identify an appropriate class of patterns
- Learn how to calculate the energy of a pattern
- Understand what pattern corresponds to the experiments
- Prove a lower bound that's sharp for this pattern

## Elaborating on the question



The magnetization  $m = (m_1, m_2)(x_1, x_2)$  is **piecewise smooth** & **divergence-free** (even across discontinuities). Also  $|m| = 1$ .

This permits a “simple” 180-deg wall, where  $m$  jumps across the axis.

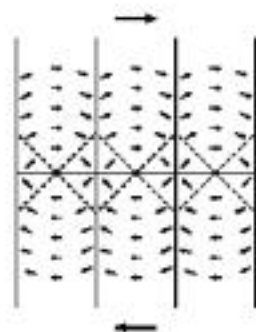


Instead the film chooses a mixture of lower-angle walls. **Why?**

Note: the pattern is **fully-determined** (constant in some regions, circles in others) except for its internal length scale.

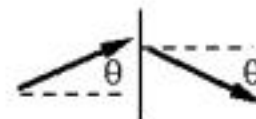
# Magnetization patterns and their energies

A **magnetization pattern** is a piecewise smooth vector field  $m = (m_1, m_2)(x_1, x_2)$  such that  $\text{div } m = 0$  (weakly, even across discontinuities) and  $|m| = 1$ . We call the discontinuities **walls**.



The **energy** of a pattern is the sum of the energies of its walls.

For a wall with total angle  $2\theta$ ,  
energy =  $(\sin \theta - \theta \cos \theta) \times \text{length}$ .

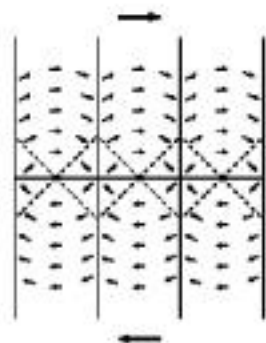


Remark: A more primitive starting point is **micromagnetics**. Our framework corresponds to “thick-film Néel walls”. Comes from micromagnetics when film thickness  $\gg$  exchange length.

## Refining the question



Energy density  $\sin \theta - \theta \cos \theta$  is **very nonlinear**. Small angles are much cheaper than large.



The proposed pattern achieves energy/length  $\sqrt{2} - 1$ . Much better than a 180-deg wall, for which energy/length = 1.

But to know this is optimal, we must prove a **geometry-independent lower bound**, showing no other pattern can do better.

## Strategy of the lower bound

Consider rectangular domain, with periodic bc at sides and  $m = (\pm 1, 0)$  at top/bottom:



**When all else fails, integrate by parts!** Look for an **entropy**  $\Sigma(m) = (\Sigma_1(m), \Sigma_2(m))$  such that

- for  $m$  smooth,  $|m| = 1$  and  $\operatorname{div} m = 0$  imply  $\operatorname{div} \Sigma(m) = 0$
- at a wall with half-angle  $\theta$ ,  $|\Sigma(m) \cdot \nu| \leq \sin \theta - \theta \cos \theta$

Every such  $\Sigma$  gives a lower bound, since

$$\text{bdry data} = \left| \int_{\text{bdry}} \Sigma \cdot n \right| \leq \int_{\text{interior}} |\operatorname{div} \Sigma| \leq \text{total wall energy}$$



# Finding the good entropy

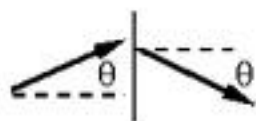
**First pass** (wrong but informative):

$$\Sigma(m) = \frac{1}{2}(\theta m + m^\perp) \quad \text{when} \quad m = e^{i\theta}$$

**First condition:**  $\operatorname{div} m = 0 \Rightarrow \operatorname{div} \Sigma(m) = 0$  for  $\theta$  smooth, since

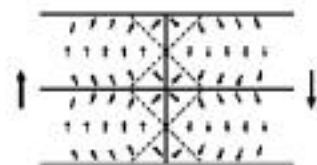
$$\operatorname{div} \Sigma(m) = \frac{1}{2} \theta \operatorname{div} m.$$

**Second condition:**  $|\Sigma \cdot \nu| \leq \sin \theta - \theta \cos \theta$ . Holds *with equality!*



$$\nu = (1, 0), \quad m = (\cos \theta, \pm \sin \theta) \Rightarrow \\ [\Sigma \cdot \nu] = \Sigma_1^R - \Sigma_1^L = \sin \theta - \theta \cos \theta.$$

**Problem:**  $\theta$  isn't well-defined,  
because the walls contain vortices.



**Successful choice** is similar in each quadrant:

$$\begin{array}{ll}
 \theta m + m^\perp + (0, -\sqrt{2}) & \text{for } -\pi/4 \leq \theta \leq \pi/4 \\
 (\pi/2 - \theta)m - m^\perp + (-\sqrt{2}, 0) & \text{for } \pi/4 \leq \theta \leq 3\pi/4 \\
 (\theta - \pi)m + m^\perp + (0, \sqrt{2}) & \text{for } 3\pi/4 \leq \theta \leq 5\pi/4 \\
 (3\pi/2 - \theta)m - m^\perp + (\sqrt{2}, 0) & \text{for } 5\pi/4 \leq \theta \leq 7\pi/4
 \end{array}$$

This gives a **continuous**  $\Sigma : S^1 \rightarrow R^2$  satisfying both our requirements. In particular: at a div-free discontinuity,

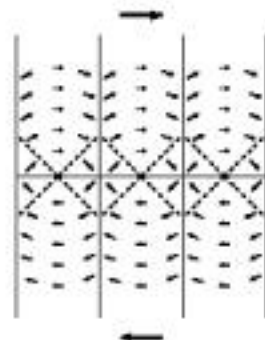
$$|[\Sigma(m) \cdot \nu]| \leq \text{wall energy density}$$

with **equality when total angle is  $\leq 90$  deg.**

Our pattern achieves the bound **because it uses only discontinuities  $\leq 90$  deg.** (No arithmetic needed!)

**Internal length scale** is set by higher-order effects. Can be explained using micromagnetics:

- *anisotropy* prefers the far-field values of  $m$ , so favors small length scale;
- *finite thickness/exchange ratio* gives walls tails that repel, favoring large length scale



**Is our cross-tie pattern unique?** (Defining feature: achieves net 180-deg wall, using discontinuities of angle  $\leq 90$  deg.)

**There's a cross-tie pattern for each wall angle  $> 90$  deg**  
(A simple discontinuity is optimal for wall-angles  $< 90$  deg)

**What is energy-driven pattern formation?** Hard to define, but “you know it when you see it.” So I’ll discuss three examples:

- (1) **Bounds on coarsening rates**
- (2) **Structure of a cross-tie wall**
- (3) **Pathways of thermally-activated switching**

**Unifying theme:** challenges to nonlinear PDE and calc of varns, coming from physics and materials science.



**Key achievement:** Explain the cross-tie wall by proving an optimal lower bound for the associated variational problem.

**Key approach:** Integration by parts, using an “entropy”  $\Sigma(m)$ .

**Related ideas:** Argument resembles (a) use of null-Lagrangians to estimate relaxed energies, and (b) use of “calibrations” to study minimal surfaces.

**Open questions:** Were we lucky? Or did there *have* to be an integration-by-parts-based argument?

(1) Bounds on coarsening rates

(2) Structure of a cross-tie wall

(3) Pathways of thermally-activated switching

tools Action minimization, sharp-interface limit

framework Kohn, Otto, Reznikoff, & Vanden-Eijnden,  
CPAM 2006

1D analysis Kohn, Reznikoff, & Tonegawa, Calc. Var. PDE  
2006

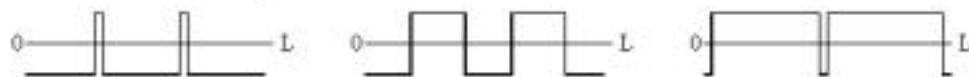
Focus on the functional

$$E = \int_{\Omega} \frac{\varepsilon}{2} |\nabla u|^2 + \frac{1}{4\varepsilon} (u^2 - 1)^2.$$

Its only local minima are  $u \equiv 1$  and  $u \equiv -1$  (for  $\Omega$  convex, or periodic boundary conditions).

**Question:** What are the pathways of thermally-activated switching?

**Answer** (1D periodic):  $N \geq 1$  "seeds" nucleate; walls propagate at constant velocity, then annihilate.



Start by explaining the question . . .

# Importance of thermal fluctuations

Nature finds **local** not global minima

- water can be heated  $> 100$  deg C
- most foams are metastable (e.g. beer)

Systems **escape** from local minima via thermal fluctuations



- $dz = -\nabla E(z) dt + \text{noise}$
- small noise  $\Rightarrow$  escape is rare

Events can be **rare** and yet **very important**

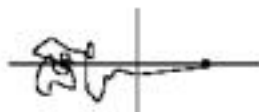
- reliability of complex systems
- failure of a computer's hard drive



# Action minimization

Think, for example, of

$$E(z) = (z_1^2 - 1)^2 + z_2^2$$



$$dz = -\nabla E dt + \sqrt{2\gamma} dw$$

Transitions are rare, yet also predictable via

**Large deviation principle:** Given that transition takes time  $\leq T$ , it occurs (with very high probability) by approx the pathway that minimizes the action:

$$\min_{\substack{z(0)=(1,0) \\ z(T)=(-1,0)}} \frac{1}{4} \int_0^T |z_t + \nabla E|^2 dt.$$

Note: the integrand is **equation error**.

## Large vs small switching times

As time allowed for switching  $T \rightarrow \infty$ , action-min path is simple:



- go uphill to lowest mtn pass
- go downhill from there

$$\begin{aligned}\frac{1}{4} \int_0^\tau |z_t + \nabla E|^2 &= \frac{1}{4} \int_0^\tau |z_t - \nabla E|^2 + \int_0^\tau \langle z_t, \nabla E \rangle \\ &= \text{nonnegative} + (E(\tau) - E(0)).\end{aligned}$$

Assertion follows, using  $\tau$  = time of arrival at ridge. Therefore “classical nucleation theory” is all about saddle points.

**Situation is different when  $T$  is fixed:**

- The optimal pathway *need not* go through a saddle.
- Note that fixing  $T$  is natural – early failures, though extremely rare, may be the ones we care about most.

## Simplest infinite-dimensional case

$$\text{Ginzburg-Landau} \quad E = \int \frac{\varepsilon}{2} |\nabla u|^2 + \frac{1}{4\varepsilon} (u^2 - 1)^2$$

SDE becomes a **stochastic PDE**. Hard to interpret except in 1D. Focusing on action minimization avoids this issue.

**Steepest descent** is  $\varepsilon u_t = -\nabla E = \varepsilon \Delta u - \varepsilon^{-1}(u^3 - u)$ , after scaling  $t$  so velocity has order 1. Sharp interface limit is motion by curvature.

**Action functional** (suitably scaled) is

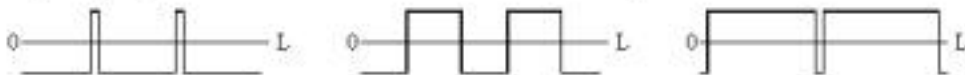
$$\frac{1}{4} \int_0^T \int_{\Omega} |\varepsilon^{1/2} u_t + \varepsilon^{-1/2} \nabla E|^2 dx dt$$

**Goal** is to minimize action subject to  $u \equiv -1$  at  $t = 0$  and  $u \equiv 1$  at  $t = T$ , in the sharp-interface limit  $\varepsilon \rightarrow 0$ .

# The sharp-interface limit

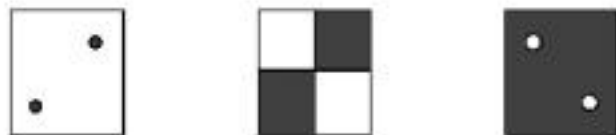
## 1D (periodic) case (rigorous)

Optimal pathway nucleates  $2N$  walls ( $N$  equispaced seeds) then propagates them at constant velocity.

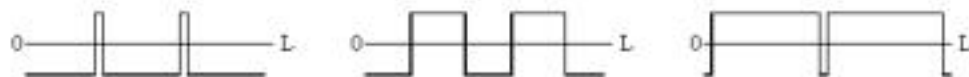


## 2D case (still only formal)

Similar; but nucleation can be cost-free (if seeds are points), and propagation can be cost-free (motion by curvature).



$$\min_{\text{trajectories}} [\text{nucl cost, if any}] + \iint (V + \kappa)^2$$



- (1) **Nucleation events** involve appearance of new walls or seeds. Not associated with saddle point or “critical nucleus.”
- (2) Heart of rigorous 1D analysis is a **structure theorem**: as  $\varepsilon \rightarrow 0$ , action integrand converges for a.e.  $t$  to a measure with point masses (at walls), varying continuously in  $t$ .
- (3) Action minimization is closely related to:
  - **steepest descent**:  $\varepsilon u_t = \varepsilon \Delta u - \varepsilon^{-1}(u^3 - u)$
  - **DeGiorgi's conjecture**:  $\varepsilon^{-1} \int |\varepsilon \Delta u - \varepsilon^{-1}(u^3 - u)|^2$

## Hints toward the analysis

(1) **Action controls the energy**, e.g. jumps in energy cost action:

$$\begin{aligned}\int_{t_1}^{t_2} \int |\varepsilon^{1/2} u_t + \varepsilon^{-1/2} \nabla E|^2 &= \int_{t_1}^{t_2} \int |\varepsilon^{1/2} u_t - \varepsilon^{-1/2} \nabla E|^2 + 4 \int_{t_1}^{t_2} \int \langle u_t, \nabla E \rangle \\ &= \text{pos} + 4(E(t_2) - E(t_1))\end{aligned}$$

(2) **Action controls wall profile and velocity**: arguing as above, and using that  $E = 0$  when  $u \equiv \pm 1$ :

$$\int_0^T \int |\varepsilon^{1/2} u_t + \varepsilon^{-1/2} \nabla E|^2 = \int_0^T \int \varepsilon u_t^2 + \varepsilon^{-1} |\nabla E|^2$$

(3) **Propagation cost is of order 1**:  $\iint \varepsilon u_t^2$  is bounded below via

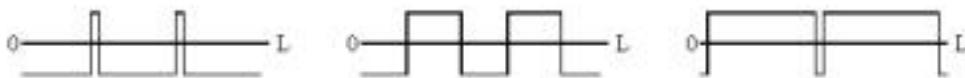
$$\frac{4}{3} |\Omega| = \int_0^T \int u_t (1 - u^2) \leq \left( \iint \varepsilon u_t^2 \right)^{1/2} \left( \iint \varepsilon^{-1} (u^2 - 1)^2 \right)^{1/2}$$

(1) Bounds on coarsening rates

tools Interpolation and energy inequalities  
work by Kohn & Otto, CMP 2002

(2) Structure of a cross-tie wall

(3) Pathways of thermally-activated switching



**Physical idea:** Focus on thermally-activated switching in fixed time  $T$ . Though rare, such events may nevertheless be very important.

**Mathematical idea:** Action minimization offers a new challenge in the analysis of sharp-interface limits.

**Wide open:** Rigorous analysis complete only for 1D Ginzburg-Landau. How about more complex models from condensed matter physics (e.g. magnetic switching)?



# What is energy-driven pattern formation?

Today's examples were:

- **Bounds on coarsening rates** via energy & interpolation ineqs
- **Cross-tie wall structure** via optimal geometry-indep bound
- **Thermal switching** via sharp-interface limit, action min

Other areas of recent progress include: twinning due to martensitic transformation; domain patterns in ferromagnets; vortex patterns in type-II superconductors.

Some common themes:

- **Questions from physics**, answers from analysis
- **Energy-driven**, but not necessarily at equilibrium
- **Focus on examples**; unity will emerge in due course

## Bounds on coarsening rates

Presented here Kohn and Otto, CMP 2002

Closely related Kohn-Yan; Pego-Dai; Conti, Niethammer & Otto

Numerical figs Puri, Bray, Lebowitz, PRE 56 (1997)

## Cross-tie wall structure

More general Alouges, Rivière & Serfaty, COCV 2002

Version here DeSimone, Kohn, Müller & Otto, review article, 2005

Experimental fig Nakatani et al, Jap. J. Appl. Phys. 28 (1989)

## Thermal switching

Framework Kohn, Otto, Reznikoff & Vanden-Eijnden, CPAM 2006

1D analysis Kohn, Reznikoff & Tonegawa, Calc Var PDE 2006

For more detail and a 4th example (**branching of domains**) see my ICM Proceedings article (on my web page).

Thanks to NSF for its generous support of this work



$t = 1$



$t = 2$



$t = 10$

Focus for simplicity on **motion by surface diffusion**

$$v_{\text{nor}} = \Delta_{\Gamma} \kappa \quad \Gamma(t) = \text{evolving curve}$$

Common belief, for random initial data:

- length scale **coarsens**,  $\ell(t) \sim t^{1/4}$
- solution is **statistically self-similar**

Evolution is **energy-driven**:

$$\frac{d}{dt} \text{Perimeter} = \int_{\Gamma} \kappa v_{\text{nor}} = - \int_{\Gamma} |\nabla_{\Gamma} \kappa|^2$$

## Why is this difficult?



- Conjectured self-similarity might be **wrong**.  
Not even clear what it means!
- Assertion that  $\ell(t) \sim t^{1/4}$  says
  - (1) Solution never stops coarsening.  
**False** e.g. for spheres. Therefore subtle.
  - (2) Solution doesn't coarsen faster.  
**True** without exception. Therefore accessible.

**Recent progress:** A weak version of (2), showing (very roughly)

$$\ell(t) \leq Ct^{1/4}$$

Two very different methods for defining local length scale  $\ell(t)$ :

Represent spatial structure by  $\chi(x) = \pm 1$ . Assume:

- spatially periodic (so averaging is easy)
- equal vol fractions (for simplicity only)

**Method 1:** Perimeter per unit volume

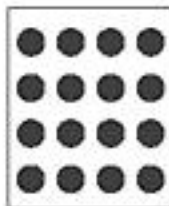
$$E = \int |\nabla \chi| \quad \text{scales like } 1/\ell(t)$$

**Method 2:** A negative Sobolev norm

$$L = \max_{|\nabla g| \leq 1} \int g \chi \quad \text{scales like } \ell(t)$$

Norm defining  $L$  is dual to  $W^{1,\infty}$ . Hence we write (heuristically)

$$L = \int |\nabla^{-1} \chi|$$



Consider 2D system of size  $R$ , with inclusions on length scale  $\ell$ . Number of inclusions is  $N \sim (R/\ell)^2$ . Take  $\chi = 1$  in black phase,  $\chi = -1$  in white.

Clearly  $E = \text{perimeter/area} = \sim N\ell / N\ell^2 \sim 1/\ell$ .

To see why  $L = \max_{|\nabla g| \leq 1} \int \chi g \sim \ell$ , argue that

- optimal  $g \sim \ell$  at inclusion centers
- optimal  $g \sim -\ell$  far from inclusions

so  $\chi g \sim \ell$ , whence  $L \sim \ell$ .

$E$  and  $L$  are related by

- interpolation inequality:** We always have

$$EL \geq \text{const.}$$

Proof makes no use of evolution law. Essentially:

$$f|\chi| \leq C (f|\nabla\chi|)^{1/2} (f|\nabla^{-1}\chi|)^{1/2}$$

- energy inequality:** Solutions of the evolution law satisfy

$$dE/dt \leq 0 \quad \text{and} \quad (dL/dt)^2 \leq 2E|dE/dt|$$

Intuition why  $dE/dt$  controls  $dL/dt$ : coarsening requires motion, which dissipates energy. Proof is simple (like most energy inequalities).

# These are sufficient (sort of)!

The **available information**

$$EL \geq C, \quad dE/dt \leq 0, \quad (dL/dt)^2 \leq 2E|dE/dt|$$

does **not** imply

$$L(t) \leq Ct^{1/4} \quad \text{or} \quad E(t) \geq Ct^{-1/4},$$

but it **does** imply a time-averaged version of the latter:

$$\frac{1}{T} \int_0^T E^3(t) dt \geq \frac{1}{T} \int_0^T (t^{-1/4})^3 dt$$

provided  $T \gg L^4(0) \gg 1 \gg E(0)$ . Proof is an ODE argument (like Gronwall's inequality).