

# Structure and Pattern Formation in Material Systems

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# Content

Landau Free-Energy/Cahn-Hilliard Functional

Swift-Hohenberg Type Dynamics/Phase-field Crystal Model

Binary Alloy

Eutectic Solidification

Amplitude Expansion

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# Landau Free-Energy Expansion

L. D. Landau

$$f_0(\phi) = a_0 + \underbrace{\frac{1}{2} a_2 \phi^2 + \frac{1}{4} a_4 \phi^4}_{\text{symmetry}} + \underbrace{a_1 \phi}_{\text{non-ideal excess/external}}$$

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- ▶ Describes symmetry breaking
- ▶ A mean field theory (uses an order parameter,  $\phi$ ), homogeneous/non-functional

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J.W. Cahn, J.E. Hilliard (1958).

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- ▶ Used to model phase segregation, or incorporate anisotropic surface tension (crystal-like)

## Example: Spinodal Decomposition

Movie.

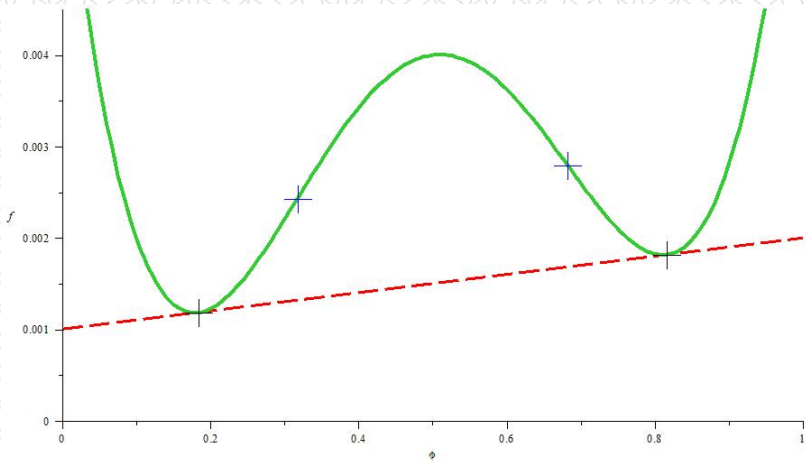
User: <http://www.youtube.com/user/fabiogarofalophd>

Source: <http://www.youtube.com/watch?v=sysya3Lo78Y>

Legend: Black is one phase, and white is the other.

The system was initialized as random.

Typical free-energy,



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### Diffusional Dynamics

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or in Fourier space,

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### Scales

$$\Delta t \propto \frac{D}{\gamma}, \quad \Delta x \propto \sqrt{\gamma}$$

$\gamma$  is the interface width/energy.

# The Idea

- ▶ We try to simulate *non-equilibrium* systems whose dynamics are driven by an ordering potential (or, as was in my case, material chemical potential).
- ▶ One such method is called 'Phase-field'.

# Digression

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- ▶ Non-equilibrium: ergodic breaking/glassy states (PFC)
- ▶ Noise is not modeled
- ▶ Length and time scales are mesoscopic (diffusive), but fluctuation to energy ratio unknown.
- ▶ Diffusion is numerically unstable under time reversal

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# The Swift-Hohenberg Equation

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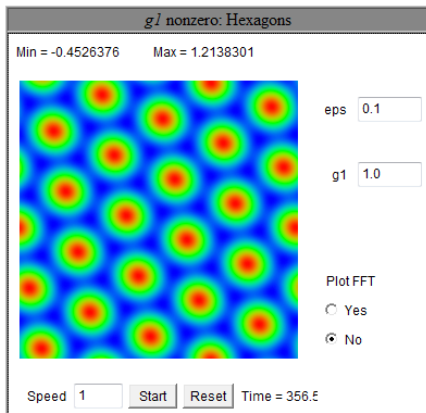
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- ▶ Applets by Michael Cross.

## Swift-Hohenberg Equation



$$\dot{\psi} = \varepsilon\psi - (\nabla^2 + 1)^2\psi + g_1\psi^2 - \psi^3$$

# Density Functional Theory/“Functional Taylor Expansion”

Density functional theory says that we can generally write the free-energy  $\frac{\mathcal{F}[\rho, \partial^n \rho]}{k_B T}$  as,

$$\mathcal{F}_{ideal}[\rho] + \sum_{n=2}^{\infty} \frac{1}{n!} \int_{\mathcal{V}} \prod_{i=1}^n d\vec{r}_i \rho(\vec{r}_i) C_n(\vec{r}_1, \vec{r}_2, \dots, \vec{r}_n)$$

the functions  $C_n$  are the  $n$ -point correlation functions defined by,

$$C_n(\vec{r}_1, \vec{r}_2, \dots, \vec{r}_n) \equiv \frac{\delta^n \Phi[\rho]}{\prod_{i=1}^n \delta \rho(\vec{r}_i)}$$

$\Phi[\rho]$  is the interaction potential energy.

# Phase-field Crystal (PFC) Model

K.R. Elder and M. Grant (2004)

$$\mathcal{F} = \mathcal{F}_{ideal} + \frac{1}{2} \iint d\vec{r} d\vec{r}' \rho(\vec{r}) C_2(|\vec{r} - \vec{r}'|) \rho(\vec{r}')$$

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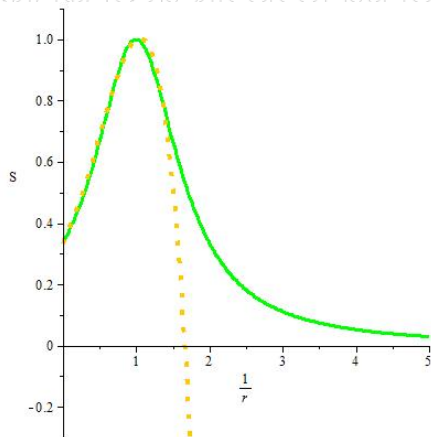
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- ▶ Atomic diffusion time-scale, long compared to phonons
- ▶ Computationally feasible for simulating mesoscopic crystalline structures

## More Details

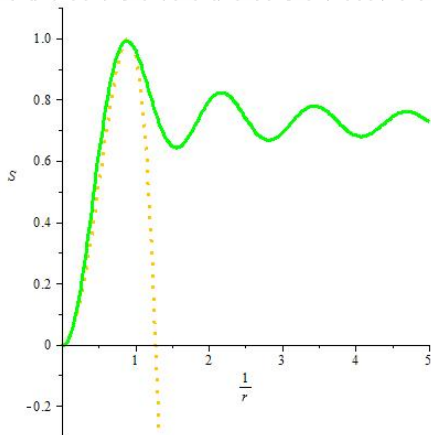


This is a qualitative structure factor for a triangular lattice.

- ▶  $\widehat{C}(r)$  is the crystallographic structure factor  $S(k)$
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## PFC: Binary Alloy

K.R. Elder et al. (2007)

We theoretically model the binary correlation function as,

$$C_{eff} = \psi^2 C_{\alpha\alpha} + (1 - \psi)^2 C_{\beta\beta} + \psi(1 - \psi) C_{\alpha\beta}$$

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- ▶ Density  $n$  of the two components are interpolated through their concentrations
- ▶ Diffusive dynamics.
- ▶ Phase diagram indicates that system can be an eutectic forming alloy.

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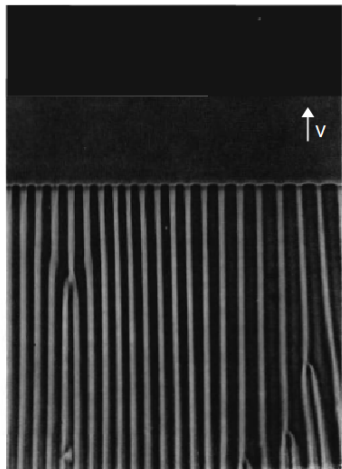
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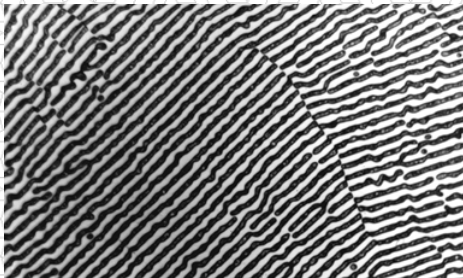
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  - Interface instabilities (Mullins-Sekerka type) and surface energy.

## Eutectic Solidification



Carbon tetrabromide-hexachlorethane eutectic.  
Image from (*arrow added*): K.A. Jackson, J.D. Hunt (1966).

# Eutectic Solidification

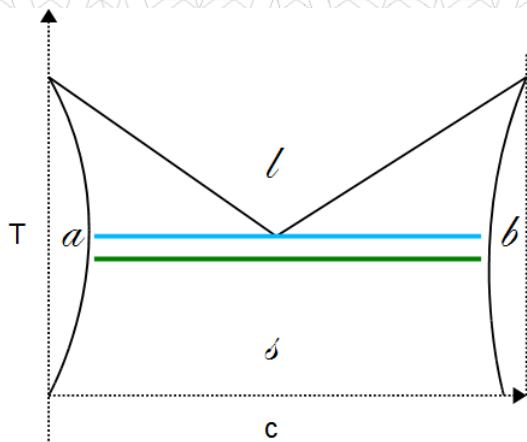


Pb-Sn eutectic.

Image from:

<http://www.mete.metu.edu.tr/pages/sdml/Research/leadfree.html>.

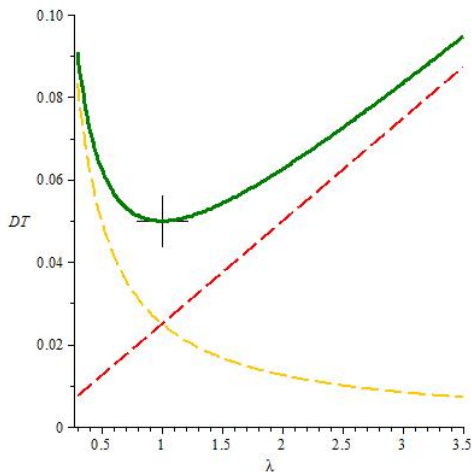
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K.A. Jackson, J.D. Hunt (1966)



Extremal condition *ansatz*:  
Spacing should minimize undercooling.

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- ▶ Annealing, zigzag bifurcation and (maybe) topology change.

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# 1D-QDRG, 1 dimensional quick and dirty renormalization group

Amplitude Expansion: K. R. Elder, Z-F. Huang, N. Provatas  
(2010)

- ▶ Renormalize to scales of mesoscopic structures along the interface.

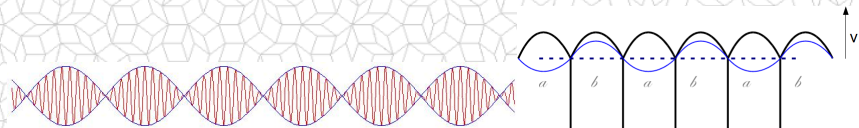
## Scheme

$n = n_0 + \eta \exp(ix) + \eta^* \exp(-ix)$ ,  $n_0 = 0$ , and,

$\psi = \psi_0 + \psi_{-1} \exp(-ix) + \psi_1 \exp(ix) + \dots$

Take,  $\frac{\partial \eta}{\partial t}$ , and  $\frac{\partial \psi_0}{\partial t}$  modes only.

\* note that complex exponentials are linearly independent.



- ▶ Keeping symmetries (1-D, translation by lattice only)

## Differential Operators

| Field/Laplacian | $\nabla^2$                            | $\nabla^2 +  k_m $                    |
|-----------------|---------------------------------------|---------------------------------------|
| $\eta \exp(ix)$ | $\frac{\partial^2}{\partial x^2} - 1$ | $\frac{\partial^2}{\partial x^2}$     |
| $\psi = \psi_0$ | $\frac{\partial^2}{\partial x^2}$     | $\frac{\partial^2}{\partial x^2} + 1$ |

- ▶ Solve for equilibrium amplitudes  $A$ ,  $B$ .
- ▶ Perturb

$$\begin{aligned}\eta + \delta\eta &= A \cos(G_{eut}x) + a \cos((G_{eut} + Q)x) \\ \psi + \delta\psi &= B \cos(G_{eut}x) + b \cos((G_{eut} + Q)x)\end{aligned}$$

- ▶ Linearize *w.r.t.*  $A$  and  $B$  and solve for eigenvalues in  $Q$ .



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- ▶ **CALCULATION INCOMPLETE!**



Thank you for your attention.  
Presentation Done.  
Any Questions?

Background image credit:

Miroslav Vicher

found on the Internet: <http://www.vicher.cz/puzzle/>