

## Phase-field modelling Lecture 7 in 4H5919

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(Home assignment)



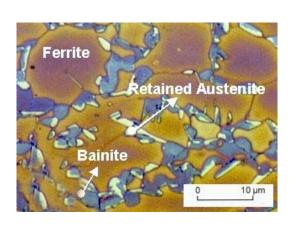
#### Outline

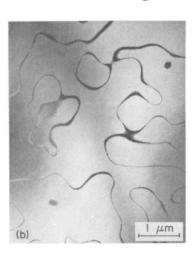
- History and background to the Phase-Field Method (PFM)
- Mathematics of the PFM
- Modelling with the PFM
- Examples of applications
- The home assignment

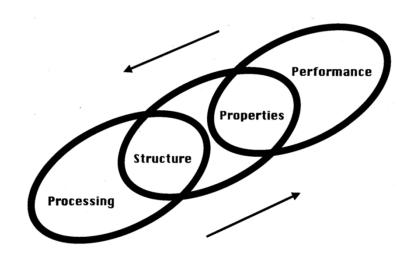


#### PFM in the ICME framework

- Creator linking process with structure
- Structure as in microstructure
  - Spatial distribution of structural features
    - Phases (with different compositions)
    - Grains (of different orientations)
    - Domains with different properties (electrical, magnetic etc.)



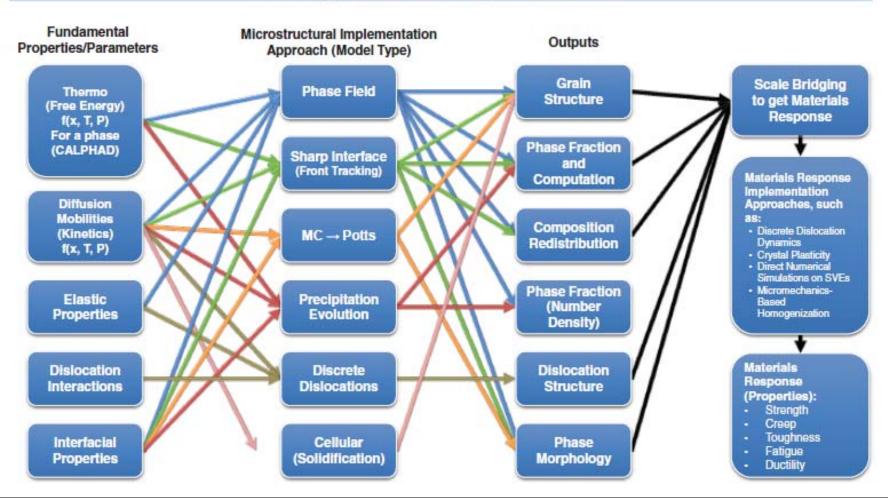






## Mesoscale modelling (nm-µm)

## Microstructural Evolution and Materials Response Length Scale





#### When should we consider the PFM?

- Modelling of moving interfaces
- Modelling microstructure evolution during phase transformations
- Effect of external stress, strain, transformation strain, anisotropic properties and complex morphologies





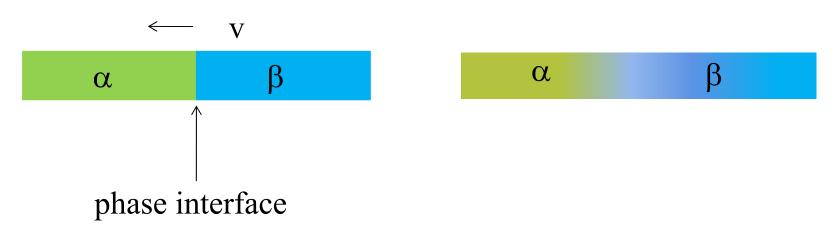
## Engineering problems suitable for the PFM

- Sintering (wetting and redistribution of alloy elements)
  - -ceramics
  - -sintered steels
  - cemented carbides
- Soldering, brazing (wetting)
- Grain growth (lowers strength)
- Precipitation/dissolution (strength -homogenisation)
- Coarsening of precipitates (lowers strength)
- Spinodal decomposition (e.g. 475°C-embrittlement in steels, strengthening of cemented carbides))
- Martensite formation



## PFM – the importance of interfaces

- The PFM is a diffuse interface method
  - Compare with DICTRA and TC-PRISMA, which are sharp interface methods
- Conditions at the interface
  - Local equilibrium assumption (DICTRA and TC-PRISMA, but not for the PFM)





# Sharp vs. diffuse interface modelling of phase transformations

#### • Sharp:

- + Easy to program, well-defined interface position
- Conditions at the interface
   Can be cumbersome in higher dimensions and for complex shapes

#### • Diffuse (phase-field):

+ Easily extended to 3D

No explicit tracking of interfaces

No need to specify conditions at the interface Good for complex shapes

Often computationally demanding
 Often requires mesh adaptivity



#### Basics of the PFM I

- The microstructure is described with a number of phase field variables e.g.
  - Concentration
  - Crystal structure
  - ...
- Time evolution of the field variables from partial differential equations (PDEs)
  - Cahn-Hilliard equation
  - Allen-Cahn equation
- No explicit tracking of the moving interfaces



#### Basics of the PFM II

• The concept of an order parameter (often denoted by  $\eta$  or  $\phi$ )

Parameters that characterizes the variations in state during a phase transformation e.g. site fraction and magnetization, Bain

variants etc.

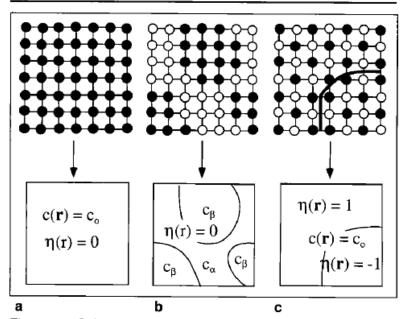


Figure 1. Schematics demonstrating the representation of morphologies by field variables. (a) disordered single phase, (b) two-phase mixture, and (c) ordered single phase.

Chen and Wang



Table I. Examples	s of the	Field Model	<b>Applications</b>
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Types of Processes	Field Variables
Isostructural Spinodal Decomposition	c
Ordering and Antiphase Domain Coarsening	n
Solidification in Single-Component Systems	'n
180° Ferroelectric Domain Formation	P (polarization)
Solidification in Alloys	ੌ c, η
Precipitation of Ordered Intermetallics with	• •
Two Kinds of Ordered Domains	ς, η
Four Kinds of Ordered Domains	$c$ , $\eta_1$ , $\eta_2$ , $\eta_3$
90° Ferroelectric Domain Formation	$P_1, P_2, P_3$
Cubic→Tetragonal Displacive Transformation or Martensitic Transformation	$\eta_{1'}^{-}, \eta_{2'}^{-}, \eta_{3}^{-}$
Tetragonal Precipitates in a Cubic Matrix	$c$ , $\eta_1$ , $\eta_2$ , $\eta_3$
Ordered Precipitate Morphology under Stress	$c_1 \eta_1, \eta_2, \eta_3$
Grain Growth in a Single-Phase Material	$\eta_1, \eta_2,, \eta_Q$
Grain Growth in a Two-Phase Mixture	$c$ , $\eta_1$ , $\eta_2$ ,, $\eta_Q$

Chen and Wang



## Short history of the PFM I

- The name "phase-field" Fix 1983 (free boundary problems)
- Studies on solidification of pure melts Langer 1980's, Kobayashi's dendrites 1990's
- Van der Waals 1893: interfaces between liquids and solids (continuous variation of the density with an extra term  $(\nabla \rho)^2$ )



## Short history of the PFM II

- 1956-58: Cahn and Hilliard and Hillert
  - Extra term  $(\nabla c)^2$ , "gradient energy"
  - Equilibrium from variational analysis.
  - Dynamics from a diffusion equation derived from the total free energy. => Cahn-Hilliard equation
- 1979: Allen and Cahn, migration of APB, change in order parameter  $\eta$  (non-conserved).
  - Dynamics from a postulated equation derived from total free energy.
  - Similar equation postulated by Ginzburg-Landau in the 1950's to represent superconductivity transformation.
  - => AC/GL-equation (Allen-Cahn/Ginzburg-Landau)



## Kobayashi's dendrites

#### Gordon Research Conference 1990's

Physica D 63 (1993) 410-423 North-Holland



## Modeling and numerical simulations of dendritic crystal growth

Ryo Kobayashi

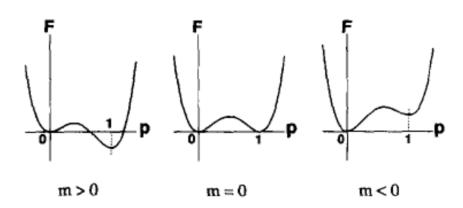
Department of Applied Mathematics and Informatics, Ryukoku University, Seta, Ohtsu 520-21, Japan

$$\dot{\tau} \phi = \varepsilon \nabla^2 \phi + \gamma \phi (1 - \phi) (\phi - \frac{1}{2} + m(T_m - T))$$

$$\dot{T} = \nabla(\lambda_T \nabla T) + \frac{L}{c_p} \dot{\phi}$$

$$f = \frac{1}{2} \varepsilon (\nabla \phi)^2 + \frac{\gamma}{4} \phi^2 (1 - \phi)^2 - L \frac{T_m - T}{T_m} 6(\frac{\phi^2}{2} - \frac{\phi^3}{3})$$

Solid  $\phi = 1$ Liquid  $\phi = 0$ 





#### Mathematics of the PFM

The total Gibbs energy:

$$G = \int_{\Omega} \left( G_m(\phi, x_k) / V_m + \frac{\varepsilon^2}{2} |\nabla \phi|^2 + \frac{\kappa^2}{2} |\nabla x_k|^2 \right) d\Omega$$

At equilibrium *G* is minimal, for fixed over-all composition. From variational calculus:

$$\frac{\delta G}{\delta \phi} = \left( \frac{\partial (G_m / V_m)}{\partial \phi} - \varepsilon^2 \nabla^2 \phi \right)$$

$$\frac{\delta G}{\delta x_k} = \frac{\partial (G_m / V_m)}{\partial x_k} - \kappa^2 \nabla^2 x_k$$



#### Variational calculus

$$I = \int F(y, y', x) dx$$

**Functional** 

$$\frac{\delta I}{\delta x}$$

Variational derivative

$$\frac{\delta I}{\delta x} = \frac{\partial F}{\partial y} - \frac{d}{dx} \left( \frac{\partial F}{\partial y'} \right)$$
 Euler-Lagrange equation



### Rate equations

$$J_{k} = -\sum L_{kj} \nabla \left( \frac{\delta G_{m}}{\delta x_{j}} \right)$$

Cahn-Hilliard Equation: "Model B"

$$\dot{x}_{k} = \nabla \cdot \left[ \sum_{k,j} \nabla \left( \frac{\partial G_{m}}{\partial x_{j}} - V_{m} \kappa_{j}^{2} \nabla^{2} x_{j} \right) \right]$$

AC/GL-equation: "Model A"

$$\dot{\phi} = -M_{\phi} \frac{\delta G}{\delta \phi} = -M_{\phi} \left( \frac{\partial G_m / V_m}{\partial \phi} - \varepsilon^2 \nabla^2 \phi \right)$$



### Modelling with the PFM I

Consider a binary two-phase system

How should we represent  $G_m(x_i, \phi)$ ?

Wheeler, Boettinger and McFadden (WBM)

$$G_m(x_1, x_2, \phi) = (1 - p(\phi))G_m^{\alpha}(x_1, x_2) + p(\phi)G_m^{\beta}(x_1, x_2) + g(\phi)W$$

Steinbach et al. Multi-Phase-Field (MPF)

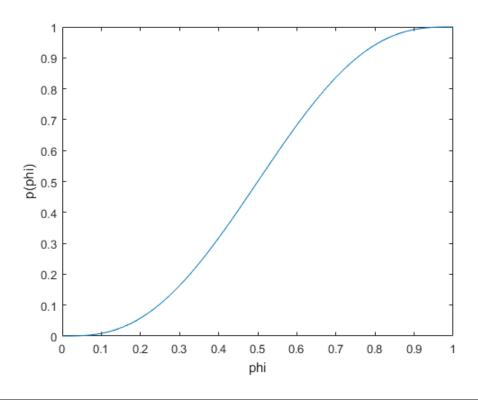
$$G_m(x_i, \phi) = (1 - p(\phi))G_m^{\alpha}(x_1^{\alpha}, x_2^{\alpha}) + p(\phi)G_m^{\beta}(x_1^{\beta}, x_2^{\beta}) + g(\phi)W$$

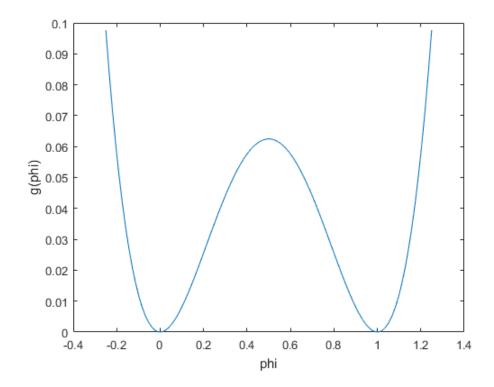


## Modelling with the PFM II

Example polynomials

$$p(\phi) = \phi^{3} (10 - 15\phi + 6\phi^{2})$$
$$g(\phi) = \phi^{2} (1 - \phi)^{2}$$







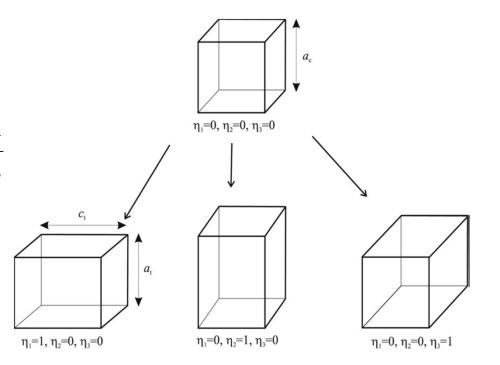
## Examples of applications

- Martensite formation in Fe-C
- Spinodal decomposition in Fe-Cr alloys
- Sigma phase formation in a duplex stainless steel



### Martensite formation in Fe-C

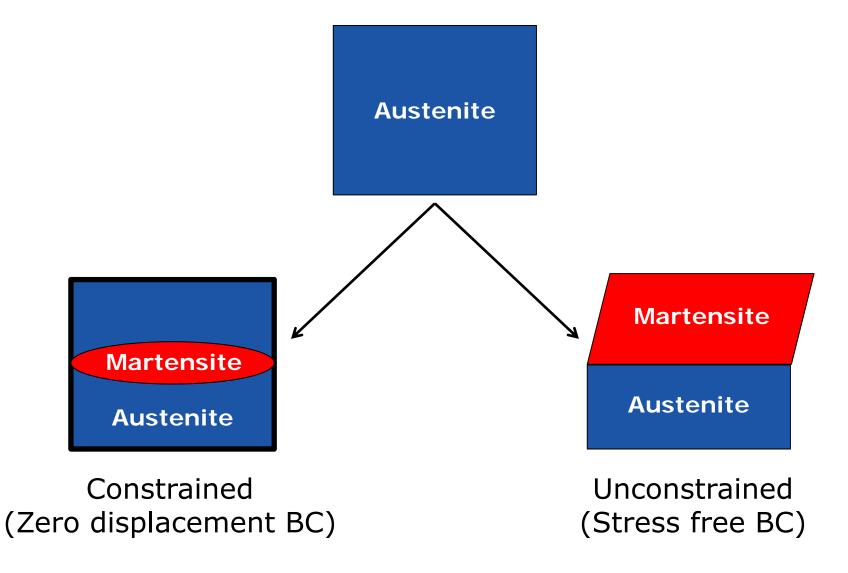
- ➤ MT is diffusionless, i.e. no variation in concentration
- >Phase field Equation:  $\frac{\partial \eta_p}{\partial t} = -\sum_{p=1}^{p=v} L_{pq} \frac{\delta G}{\delta \eta_p}$  (Allen-Cahn)
- ▶L<sub>pq</sub>: Kinetic coefficient, corresponds to interface mobility
- $\triangleright$  Phase field variable:  $\eta_p$ :  $(\eta_1, \eta_2, \eta_3)$
- $\triangleright$ G =G<sub>chemical</sub> + G<sub>gradient</sub> + G<sub>elastic</sub> + G<sub>plastic</sub>



One Allen-Cahn type equation for each Bain variant



## Shape of Martensite...





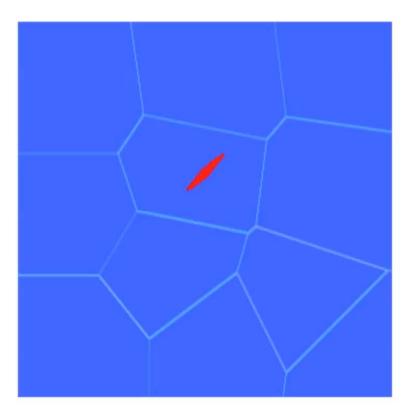
### Simulation parameters

- >Fe-0.3C alloy
- ➤ Physical size of the system: 1µm
- ➤ M<sub>s</sub> temperature (Experimental value)
- ➤ Driving force calculated from Thermo-Calc at M<sub>s</sub>
- $\triangleright$ Bain strains ( $\varepsilon^{T}$ ) calculated from Lattice constants (Experimental)
- ➤ Isotropic Elasticity case : E = 200 GPa
- ➤ Anisotropic Elastic modulii(c): Experimental values

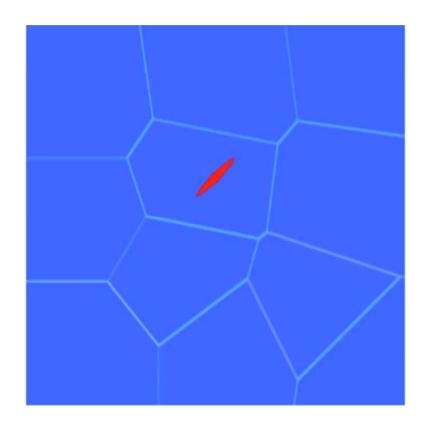


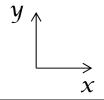
# Martensite formation in Fe-C: 2D simulation

#### Zero displacement BC

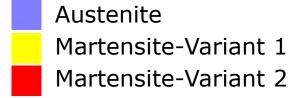


**Stress free BC** 



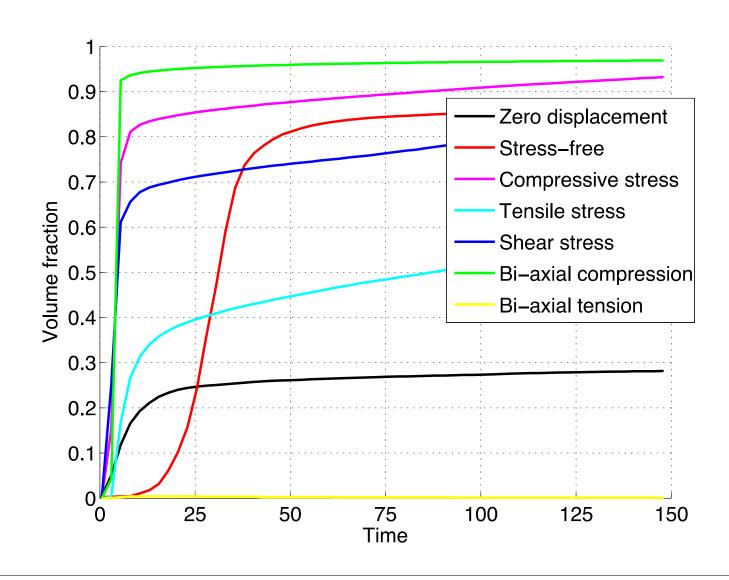


Malik et al.





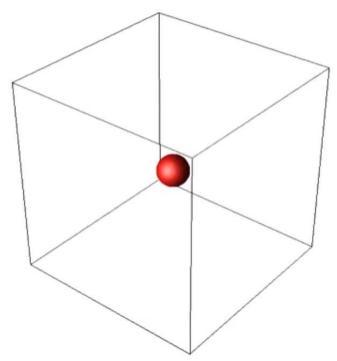
### Results from 2D simulations



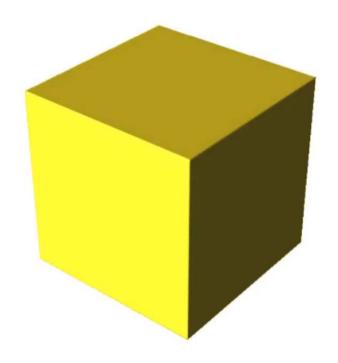


# Martensite formation in Fe-C: 3D simulation

#### Zero displacement BC



**Stress free BC** 



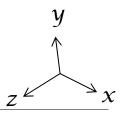
Austenite

Martensite-V1

Martensite-V2

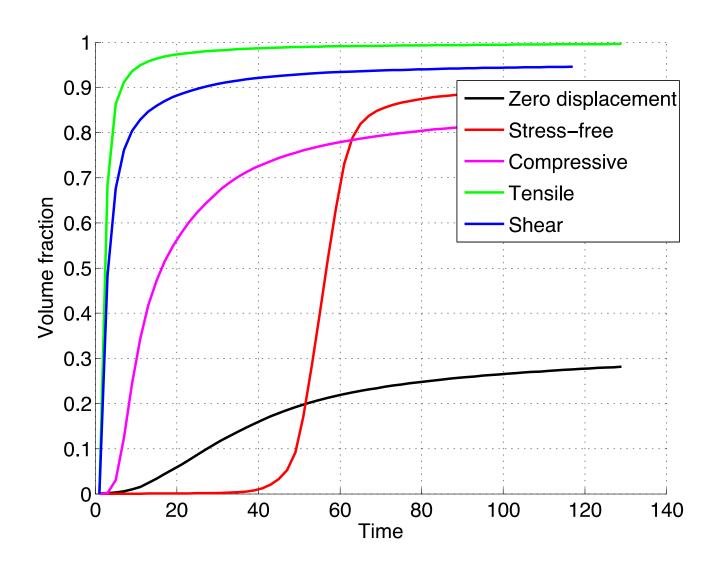
Martensite-V3

Malik et al.





### Results from 3D simulations





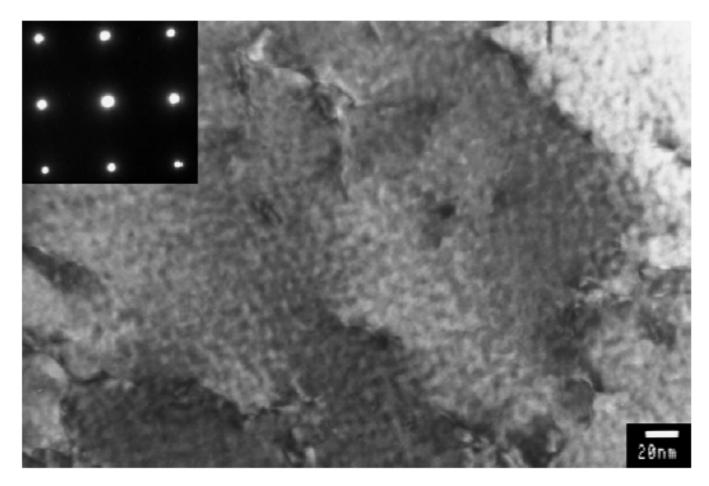
#### Conclusions

- 3D simulations are required to investigate the stress effects!
- •In a Fe-0.3%C system:
  - Maximum volume fraction of the martensite phase can be achieved by applying the tensile stress.
  - Applying the compressive stress, reduces the volume fraction of the martensite phase.



# Characteristic features of spinodal decomposition

Modulated or mottled constrast in ferrite in a duplex stainless steel

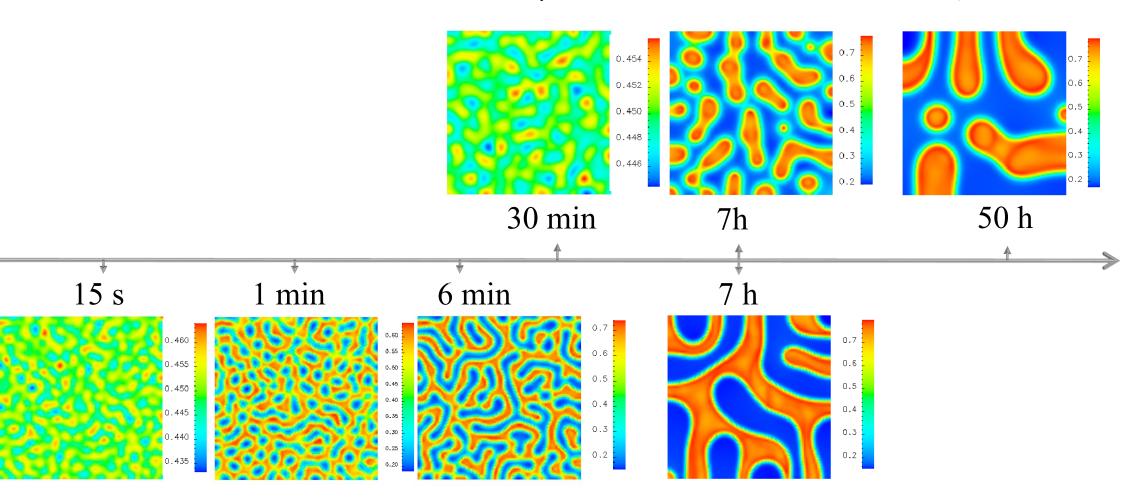


Hättestrand et al.



## Solving the Cahn-Hilliard equation: Simulation results for Fe-45at%Cr at 773K

Thermodynamics: Andersson and Sundman, 1987



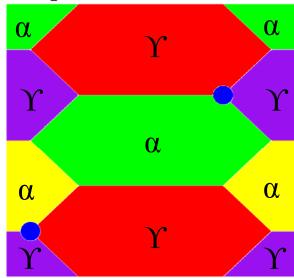
Thermodynamics: Xiong et al., 2010



# Sigma phase formation in a duplex stainless steel (Fe-25Cr-7Ni-4Mo)

#### Continuous Cooling from 1273K to 950K

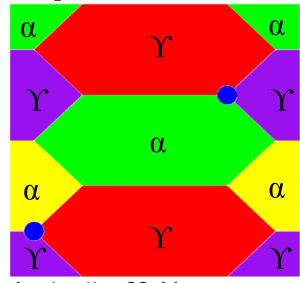
Time = 0.0 s Temp = 1273.00 K



Austenite: 60.44 Ferrite: 38.45 Sigma: 0.73

1K/s

Time = 0.0 s Temp = 1273.00 K

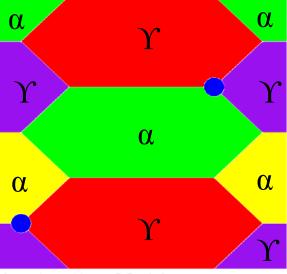


Austenite: 60.44 Ferrite: 38.45 Sigma: 0.73

50K/s

Time = 0.0 s

Temp = 1273.00 K



Austenite: 60.44 Ferrite: 38.45 Sigma: 0.73

100K/s

Malik et al.



## Issues in phase-field modelling

- Computational efficiency
- Realistic length scales: interfaces thicknesess vs. size of grains/phase domains
- Number of domains/grains
- Nucleation
  - Evolution equations are deterministic i.e. explicit nucleation events cannot be handled with the original Cahn-Hilliard, Allen-Cahn equations

$$\frac{dG}{dt} \le 0$$



#### Codes for the PFM

- Most groups in the field have their own in-house code
- Many open source codes available for solving PDEs
  - femLego
     (https://www.mech.kth.se/~minh/femLegoPar/introduction.htm)
  - FiPy (<u>http://www.ctcms.nist.gov/fipy/</u>)
  - Moose (<u>http://mooseframework.org/</u>)
  - OpenPhase (<u>http://www.openphase.de/</u>)
  - ...
- One commercial code: MICRESS (<a href="http://web.micress.de/">http://web.micress.de/</a>)



## The home assignment

- Implement WBM and MPF for a binary, two-phase system using e.g. Matlab
- Perform numerical experiments
- Discussion of the home assignment Friday May 12, 9-10 (Efim Borukhovich)