#### Field Method of Simulation of Phase Transformations in Materials

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#### What do we need to account for?

Multi-phase states: thermodynamic systems may have multiple stable phase 'coexisting' at the same conditions.

Heterogeneous states: phase transformations may go along very complicated paths.

Dynamic structures: rate of transformation can make a difference for the final structure and properties

Nucleation: phase transformations are initiated through the process of overcoming of some kind of a potential barrier.



Pillar 1: Order Parameter: Symmetries of the System

Order-disorder transformation in  $\beta$ -brass (Cu-Zn alloy)



#### Pillar 2: Free Energy $g(T,\eta) = g_0(T) + \frac{1}{2} W \eta^2 + \frac{1}{3} (\Delta \mu) \eta^3 + \frac{1}{4} \eta^4 \longleftarrow$ Landau potential 0.04 stable phase: 'crystal' 0.03 transition state metastable phase: 'liquid' free energy g 0.02 W—potential barrier metastable stable phase phase W energy scale 0.01 $\Delta \mu$ 0 $\Delta\mu$ -chemical potential difference reaction coordinate -0.01 0.8 1.2 0 0.4

order parameter n

 $\Delta \equiv \Delta \mu / W$ -driving force

## Pillar 3: Heterogeneous Systems: **Gradient Energy** $G = \int [g(W,\eta) + \frac{1}{2} k (\nabla \eta)^2] dv$ Correlation length: $\xi = \sqrt{\frac{\kappa/W}{1-\Lambda}}$ – interface thickness

Length

scale:

Interfacial energy:  $\sigma = \sqrt{\kappa W}$ 







#### Pillar 4: Kinetics



M.I. Mendelev, J. Schmalian, C.Z. Wang, J.R. Morris, and K.M. Ho, *Phys. Rev. B*, **74**, 104206 (2006).

#### Pillar 5: Internal fluctuations: Langevin force

$$\frac{d\eta}{dt} = -\gamma (\frac{\delta G}{\delta \eta})_{T,P} + \zeta(x,t)$$
$$<\zeta(x,t) >= 0$$
$$<\zeta(x,t) \zeta(x',t') >= \int \delta(x'-x) \,\delta(t'-t)$$
$$\Gamma = 2\gamma k_B T$$

 $\zeta(\mathbf{x}, \mathbf{t})$ —noise: Gaussian, white, additive

One more energy scale: thermal fluctuations-k<sub>B</sub>T



#### Pillar 6: 'Hydrodynamic Modes':



Momentum Flow (Pressure or Stress) Diffusion (Concentration of species) Electromagnetic Field Variation (Waves) Heat Flow (Temperature Variation):

'Thermodynamically consistent heat equation' A. Umantsev and A. Roytburd. <u>Sov. Phys. Solid State</u> **30**(4), 651-655, (1988)

General Heat-Equation  $\rightarrow$ 

$$O\frac{dT}{dt} = \nabla(\lambda \nabla T) + Q(\mathbf{x},t)$$

Heat Source 
$$\rightarrow Q(\mathbf{x},t) = -[(\frac{\partial e}{\partial \eta})_{V,T} - \kappa_E \nabla^2 \eta] \frac{d\eta}{dt}$$
  
 $\uparrow$  Latent Heat  $\square$ 

Length ScalesTime scales
$$l_I = \sqrt{\frac{\kappa}{W}}$$
 - interfacial thickness $\tau = \frac{1}{\gamma W}$  $l_C = \frac{CT_E \sigma}{L^2}$  - capillary length $\begin{pmatrix} C \\ T_E \\ U \\ W \\ \kappa \\ \lambda \\ \mu \end{pmatrix}$  $relaxation time$  $l_{\mu} = \frac{\lambda}{\mu L}$  - kinetic length $\kappa^{\kappa}_{\lambda}$  $\kappa_{\mu} = \frac{\lambda C}{(\mu L)^2}$  $l_T = \frac{\lambda}{CV_n}$  - thermal length $\kappa^{\kappa}_{\lambda}$  $\mu$  $K^{-1}$  - radius of curvature $dynamic$  $U = \frac{l_C}{l_I} = \frac{CT_E W}{L^2}$  $R = \frac{l_{\mu}}{l_C} = \frac{\lambda}{C\gamma\kappa}$ 

#### Truly Multi-Scale Method



#### **Real Material Modeling**

**Problem A**: Convert thermodynamic functions of two or more phases into a continuous Landau-Gibbs Free Energy

Solution 1: LTPT: Symmetry expansion Solution 2: Speculate



**Problem B**: Find the PFM parameters:  $\{W_i, \kappa_i, \gamma_i\}$ 

<u>Solution 1</u>: Calculate from First Principles <u>Solution 2</u>: Calibrate from experiments or MD/MC simulations





coordination OP

crystallization OP

#### Measurable Quantities

Interface thickness: 
$$l_I \sim \sqrt{\frac{\kappa}{W}}$$

Interface energy: 
$$\frac{free\ energy}{unit\ area} \equiv \sigma \sim \sqrt{\kappa W}$$

Kinetic coefficient: 
$$\frac{interface \ velocity}{1K \ of \ supercooling} \equiv \mu = \gamma \sqrt{\frac{\kappa}{W}} \frac{L}{T_E}$$

**Equilibrium Fluctuations of OP** 

Non-Equilibrium Fluctuations of OP

$$\langle \left| \widehat{\Delta \eta}_{V}(\mathbf{k}) \right|^{2} \rangle = \frac{k_{B}T}{V \left[ \frac{\partial^{2}g}{\partial \eta^{2}}(\overline{\eta}) + \kappa |\mathbf{k}|^{2} \right] }$$

$$\begin{array}{c} \text{Dynamic} \\ \text{Structure} \\ \text{factor} \\ \end{array}$$

$$\begin{array}{c} \text{time} \end{array}$$

#### Materials Genome



RESEARCH

#### **Database of Interfacial Properties**

RESEARCH AFLOW DATAE gh-throughput Calculations for Materials Propertie PUBLICATIONS OPEN POSITIONS

	A	В	C	D	E	F	G	н		JK	L	M	N	0	P	Q	K	S		0	V	VV	X
1 Crystallization database for pure substances.																							
2						estimates																	
3	Quantity	Te	L	C	ρ	λ	σ	μ	δ	B=3σ/(16δ)	Ta=L/C	α=λ/(ρC)	m=Teμσ/(Lp)	X=σ/(Lρ)	/c=TeCo/(	ρL^2) <sup>*</sup> /μ=λ/(μρL	.)	Q=L/CTe	=T E=16B/3L	. U=TeCB/(p	L^2]R=/μ/δ	RU	y
4	Units	K	J/kg	J/kg*K	kg/m <sup>3</sup>	J/K*m*s	J/m <sup>2</sup>	m/s*K	m	J/m <sup>3</sup>	K	m <sup>2</sup> /s	m <sup>2</sup> /s	m	m	m				≈lc/δ			m <sup>3</sup> /Js
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6	Aluminum	933.52	3.87E+05	5 900.00	2699	210	1.15E-0	1 10	1.00E-09	2.16E+07	4.30E+02	8.65E-05	1.03E-06	1.10E-	10 2.3	9E-10 2.0111E	-08	4.61E-	01 1.10E-0	1 4.48E	-02 20.11	1005 9.02	E-01
7	Aluminum	939.30	3.71E+05	1252.00	2332	0.777	1.02E-0	1 0.65	1.00E-09	1.92E+07	296.33387	2.66127E-07	7.23E-08	1.18355E-	10 3.7515	3E-10 1.3816E	-09	0.31548	37 1.18E-0	0.070341	253 1.3810	356 9.72	E-02
8	Cobalt	1765.15	2.59E+05	5 799.10	8900	25.08	4.00E-0	2 1.88	1.00E-09	7.50E+06	3.24E+02	3.53E-06	5.75E-08	1.73E-	11 9.44	4E-11 5.78E	-09	1.84E-	01 1.73E-0	2 1.77E	-02 5.78E	+00 1.02	E-01
9	Copper	1356.15	2.05E+05	6 493.70	8930	170.5	1.36E-0	1 1.58	1.00E-09	2.55E+07	4.15E+02	3.87E-05	1.59E-07	7.43E-	11 2.4	3E-10 5.90E	-08	3.06E-	01 7.43E-0	2 4.55E	-02 5.90E	:+01 2.68E	+00
10	Helium	35.04	6.60E+04	2975.00	410.3	0.117	1.70E-0	4 0.2	1.00E-09	3.19E+04	2.22E+01	9.59E-08	4.40E-11	6.28E-	12 9.92	2E-12 2.16E	-08	6.33E-	01 6.28E-0	3 1.86E	-03 2.16E	+01 4.02	E-02
11	Hydrogen						8.74E-0	4		#DIV/0!			#DIV/0!	#DIV/0!		#DIV/0	)!	#DIV/0	! #DIV/0!	#DIV/0!		#DIV	/0!
12	Nickel	1725.15	2.92E+05	735.00	8900	40.96	4.64E-0	1 0.39	1.00E-09	8.70E+07	3.98E+02	6.26E-06	1.20E-07	1.78E-	10 7.74	4E-10 4.04E	-08	2.30E-	01 1.78E-0	1 1.45E	-01 4.04E	:+01 5.86E	+00
13	Nickel	1728.00	2.64E+05	540.00	8900	90.9	3.70E-0	1 2	5.00E-10	1.39E+08													4.90E+02
14	Lead	600.65	2.30E+04	129.00	10660	34.4	2.99E-0	2 0.28	1.00E-09	5.61E+06	1.78E+02	2.50E-05	2.05E-08	1.22E-	10 4.1	1E-10 5.01E	-07	2.97E-	01 1.22E-0	1 7.70E	-02 5.01E	:+02 3.86E	+01
15	Phosphor	u 317.10	8.47E+04	3310.16	1745	0.1881	8.00E-0	3 0.177	1.00E-09	1.50E+06	25.6	3.26E-08	3.04E-09	5.41E-	11 6.7	0E-10 7.19E	-09	8.07E-	02 5.41E-0	2 1.26E	-01 7.19E	+00 9.03	E-01
16	Silver	1234.15	1.05E+05	5 284.50	10500	204.5	1.11E-0	1 1.65	1.00E-09	2.08E+07	3.67E+02	6.85E-05	2.06E-07	1.01E-	10 3.4	0E-10 1.13E	-07	2.98E-	01 1.01E-0	1 6.37E	-02 1.13E	:+02 7.20E	+00
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#### Soldering: InterMetallic Phase Growth



Cu-Plate



←Liquid-state solder Solid-state solder

← Where was the original interface ← between the tin and copper? ←



→ <mark>0</mark>

5um

Gagliano and Fine'00

Onishi and Fujibuchi'75

#### Experimental results

Lord & Umantsev, J. Appl. Phys. **98**, 063525 (2005) (Centennial Campus, 2004)

. M

PLC

baseline

IMP



Grain Boundary Contribution to Free Energy

1.  $f_{ori} = f(\theta)$ —not invariant against rotation of the reference frame

2.  $f_{ori} = f(\theta_1, \theta_2, \theta_3, ...)$ —orientation =order parameter

3.  $f_{ori} = f(|\nabla \theta|) = s |\nabla \theta| + q |\nabla \theta|^2$  —Kobayashi, Warren, Carter

 $f=\ldots+[1-s(\xi)]f_{liquid}(c)+[s(\xi)-s(\eta)]f_{solid}(c)+s(\eta)f_{intermet}(c)$ 

**Dynamics** 

$$\frac{\partial \theta}{\partial t} = -\gamma_{\theta(\xi,\eta)} \frac{\delta F}{\delta \theta}$$

Grain-boundary diffusion: Mobility:  $M=M(\xi,\eta,|\nabla\theta|)$ 



### **Evolution Equations**

Crystallization

 $\frac{\partial \xi}{\partial t} = -\gamma_{\xi} \frac{\delta F}{\delta \xi}$ 

Ordering





**Parameters: 3** Diffusion coefficients: solder intermetallic substrate +9 interfacial parameters (interface energies thicknesses, and mobilities)

Diffusion

$$\frac{\partial c}{\partial t} = \nabla [M(\xi,\eta,c)\nabla \frac{\delta F}{\delta c}]$$
  
$$M = M_{liq} + (M_{sol} - M_{liq})\xi + (M_{int} - M_{sol})\eta$$

**Scales:** Length=0.25nm Time=0.25µs

Initial Conditions: slab, no nucleation

#### 2D Modeling



# Phase Field Simulation of Nucleation at Large Driving Forces

<u>Lifetime</u>: time for a supercritical nucleus to appear in the system. Advantages:1. more reliable theory 2. free-energy landscape

#### 3D as opposed to 2D

Correlation properties of the fluctuations are very different.

#### Numerical simulations

 $\Delta x$ ,  $\Delta t$  are not just grid parameters. They are physical quantities—the noise correlation length and time.





#### Supercritical Nucleus











#### Time Evolution of the System



#### Free Energy Barrier



10 20 30 40 50 60 70 80 90 100

#### **3D Structure of Supercritical Nucleus**



Shape characterization

- 1. Volumetric content
- 2. Eccentricity
- 3. Roughness
- 4. Probability distribution

