



Materials and Solid Mechanics

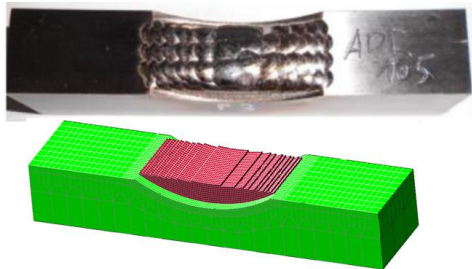
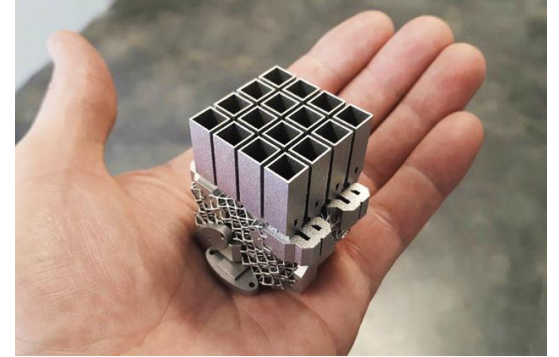


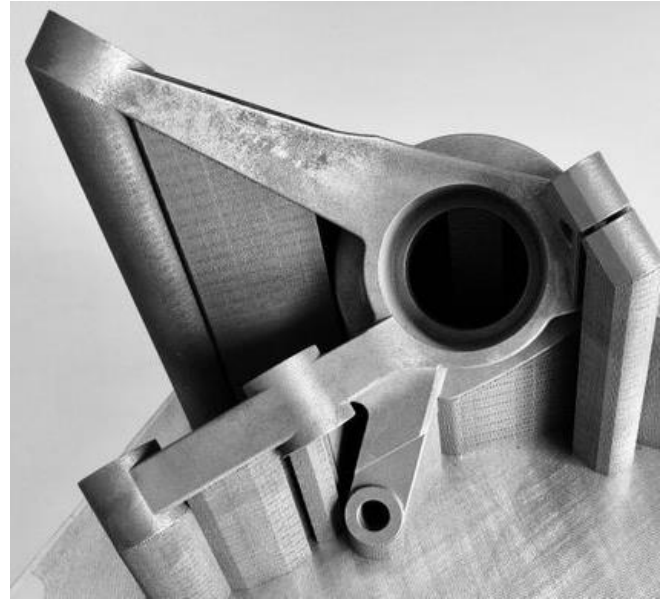
# How finite element simulations and phase field method interact to predict material properties of additive manufacturing samples

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Anne Mertens,  
Anne Marie Habraken

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- ❖ Motivation
- ❖ Computational Frame work
  - Finite Element
  - Phase Field
- ❖ Conclusion





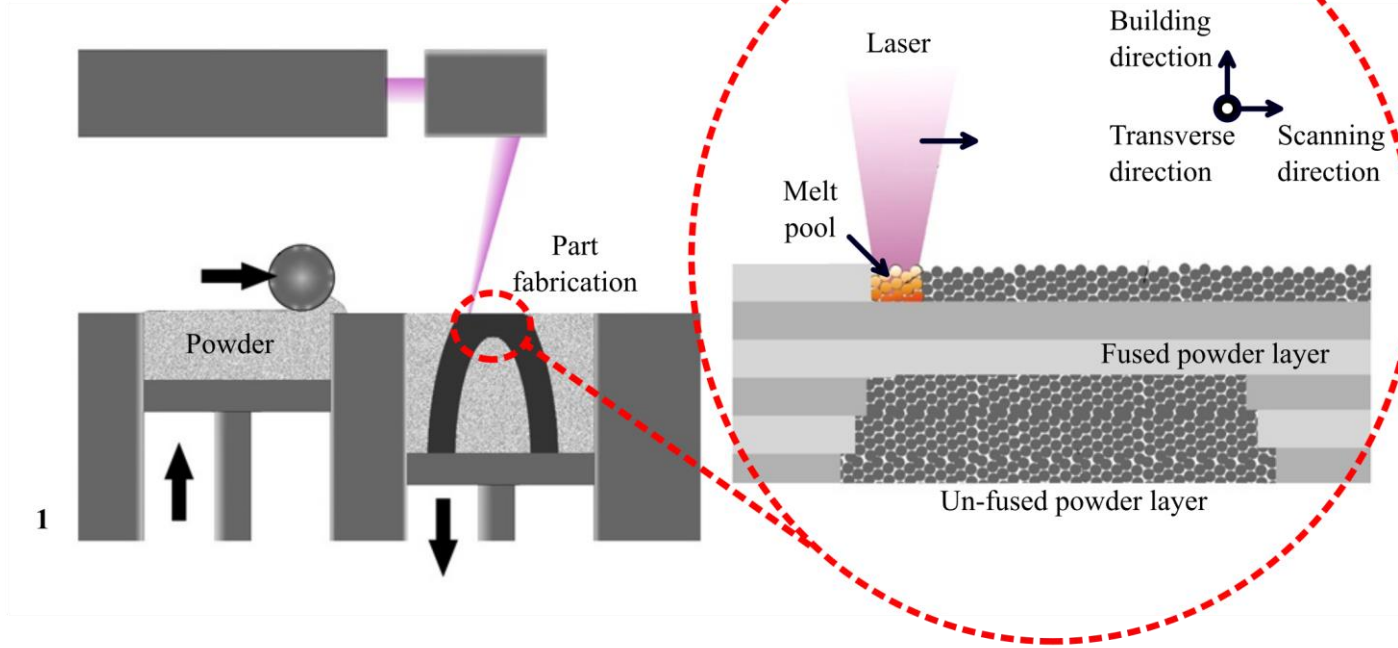
## Motivation

Provide guidance in Additive Manufacturing & Post treatment

# Background : the process

Laser Powder Bed Fusion process (LPBF)

(Selective Laser Melting SLM)

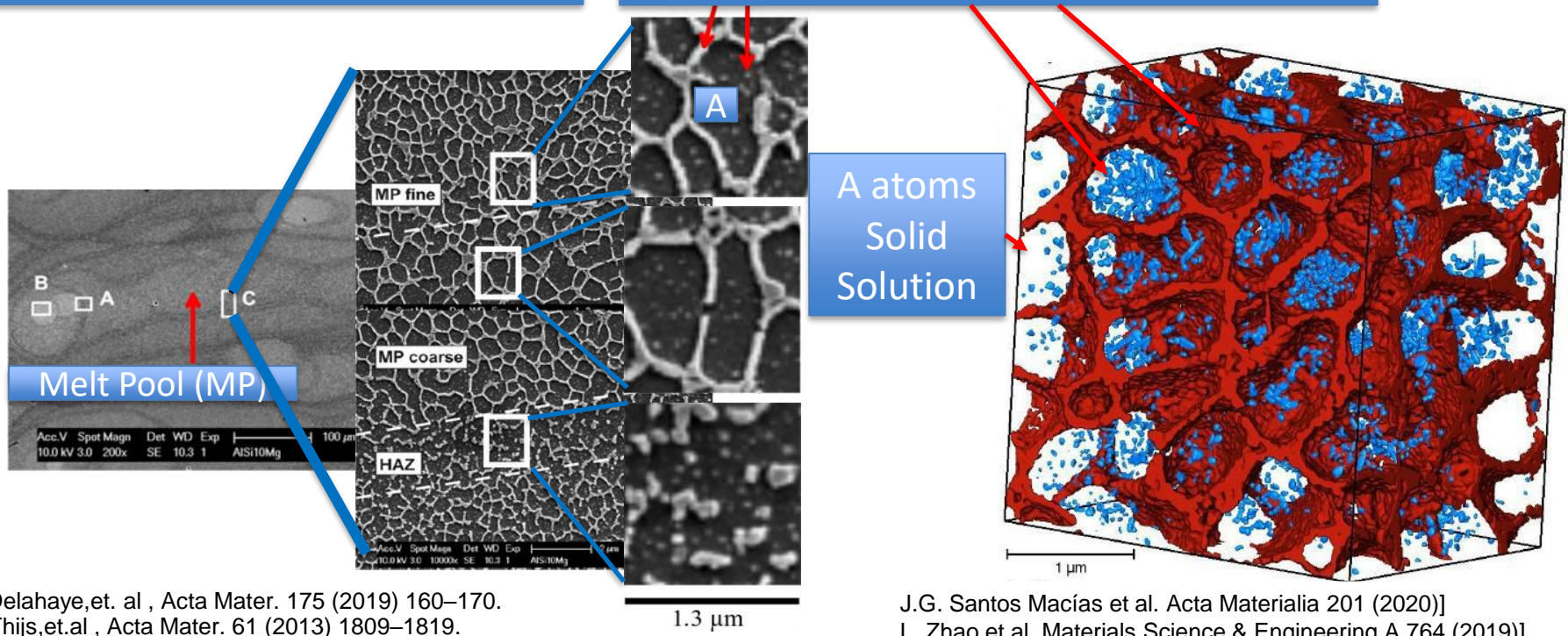


# The microstructure: bi phasic material A-B

Cell Size different in the melt pool  
 Melt Pool core ( MP Fine)  
 Melt Pool Boundary (MP Coarse)  
 Heat Affected Zone

B atoms  
 → Walls (eutectic rich zone + precipitate)  
 → Precipitate in the cell  
 → Some in solid solution within the cell

Typical  
 As-Built  
 Material

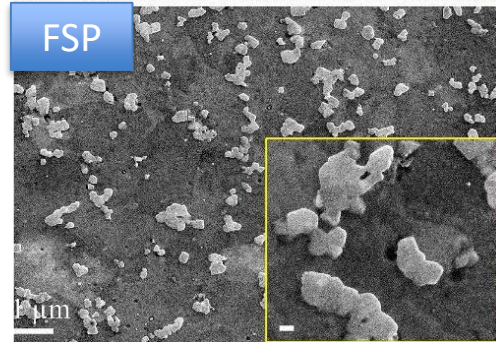
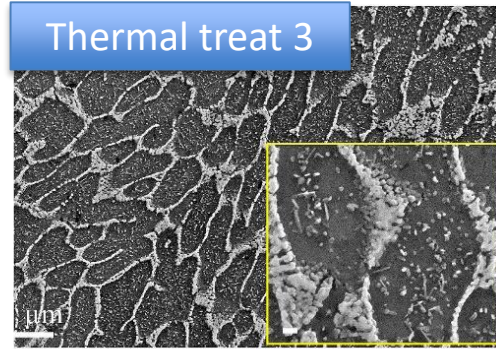
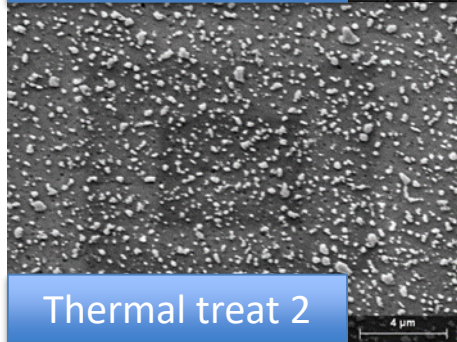
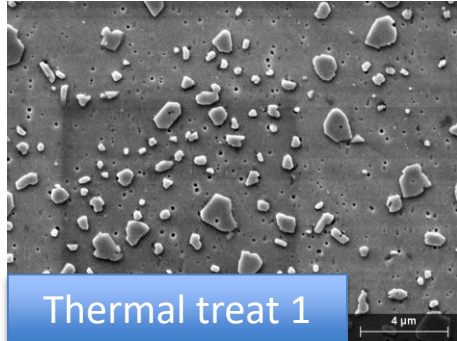


A atoms  
 Solid  
 Solution

# Bi phasic material evolution

Eutectic network defining wall can disappear  
Globules of B material can appear  
“Matrix” of A material (still solid solution)

Microstructure evolution

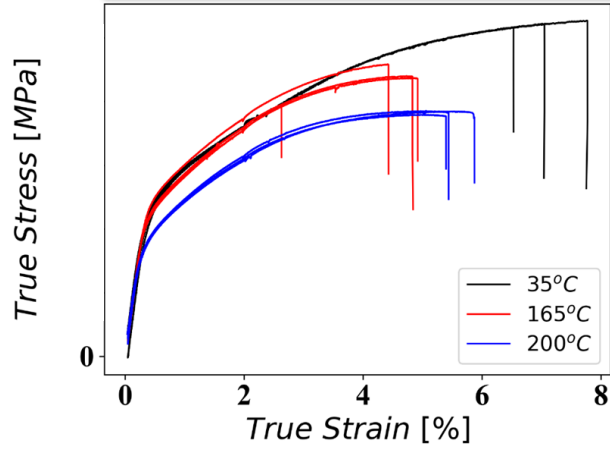


After  
Heat Treatments  
Friction Stir Processing

...

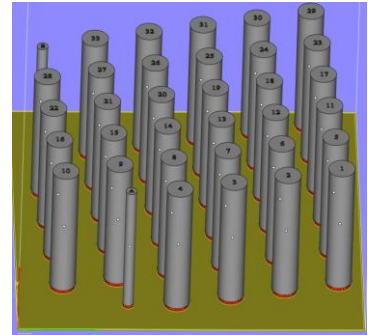
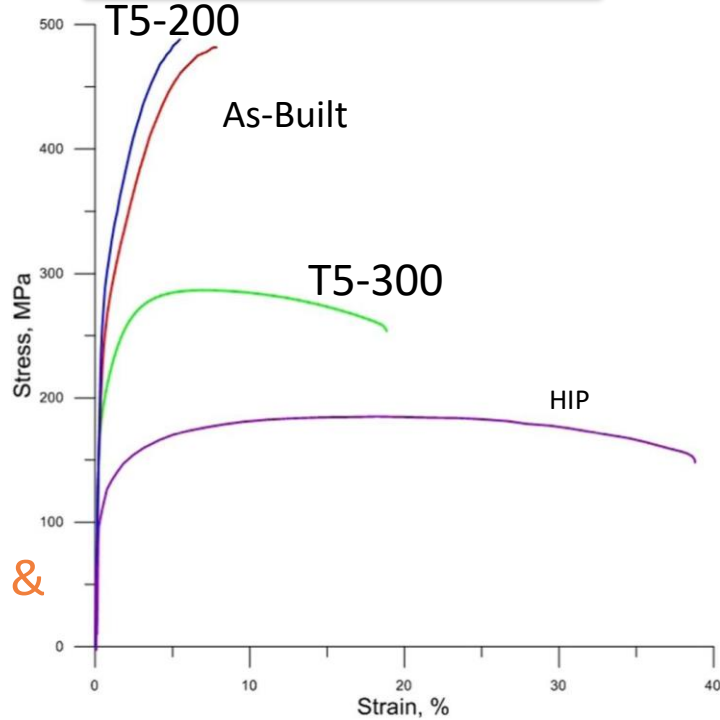
# Static properties linked with microstructure

Tensile tests for different built platform tp°



LongLifeAM results courtesy of MMS team

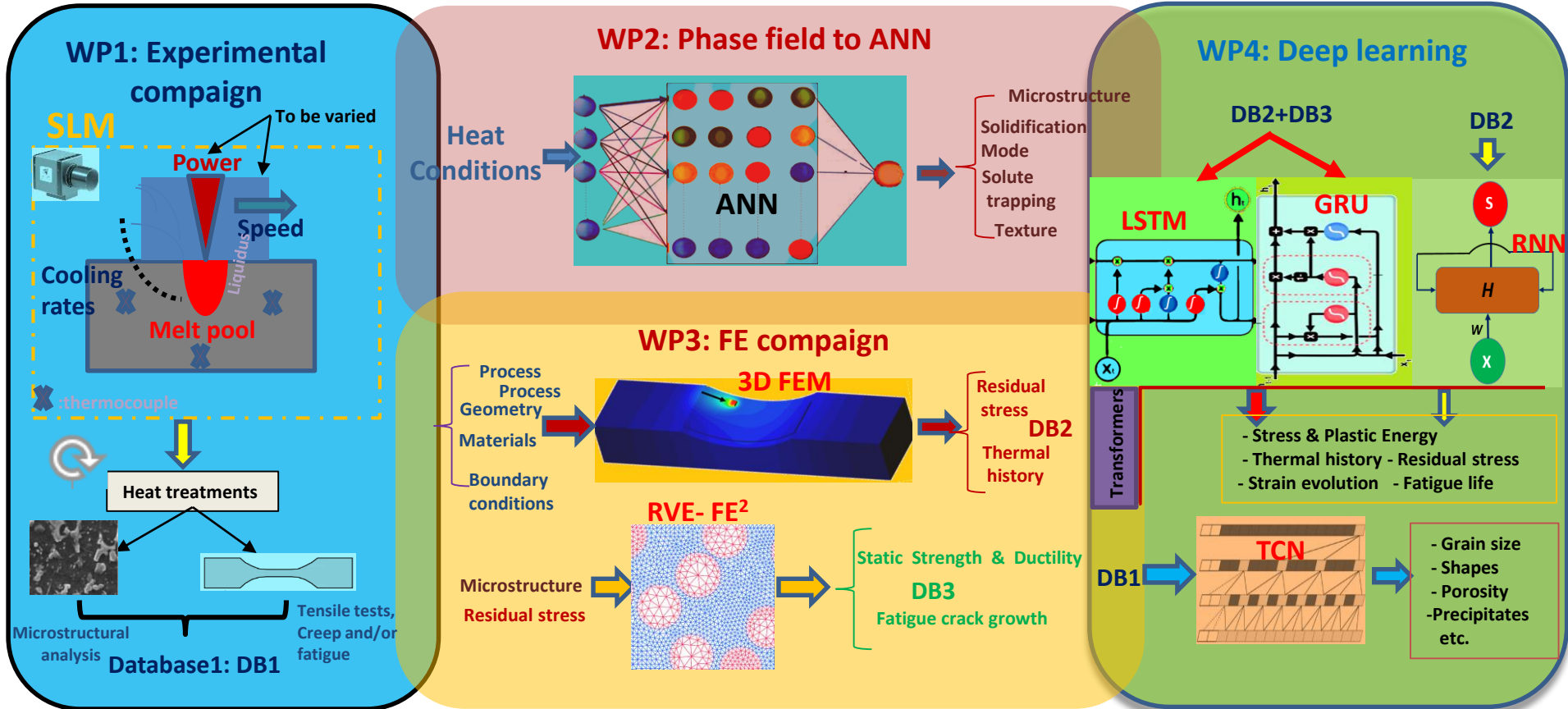
Tensile tests for different post treatments



Selection of process parameters & post treatments could benefit some guidance

# Computational Frame work

Today focus : Thermal FE and Phase Field  
→ Microstructure





FE model



Temperature history



Phase Field



Microstructure evolution

Iterative loop ?



Microstructure evolution



New thermo-physical  
properties

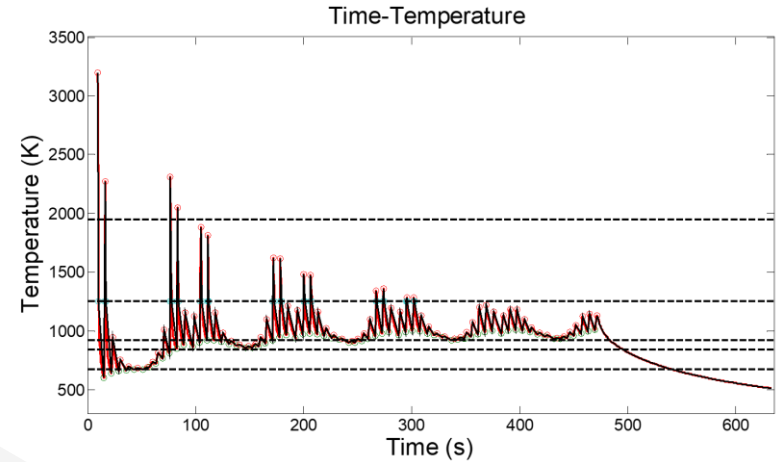
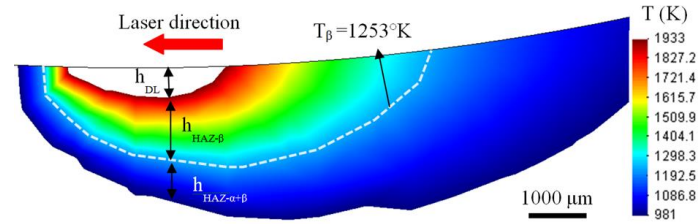


New Temperature  
history

Final Microstructure



Final Properties

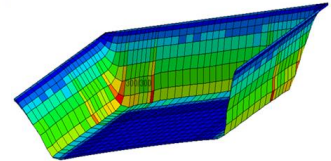
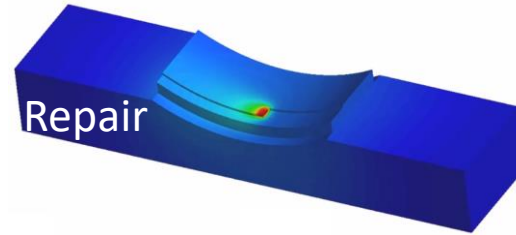
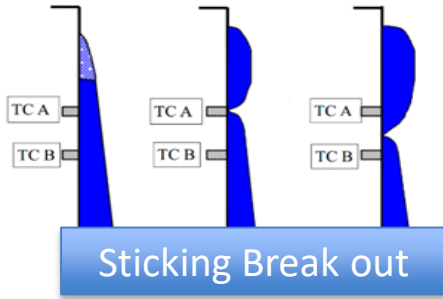
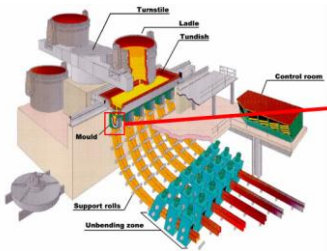


## Finite Element Model

Predict the  $T_p^\circ$  history, melt pool size...

# FE thermal model

- ▶ Lagamine thermo-mechanical-metallurgical FE code (developed since 1982)



- Validated by Abaqus, Comsol, Astar and experiments
- Validated on DED for 3 materials

H.-S Tran et al. Materials & Design, 204, 128, 2017, 3D case of Ti6Al4V

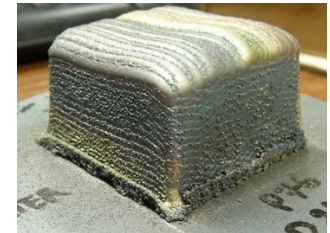
R. Jardin et al. Metals 2020, 10, 1554, 3D case of M4 high speed steel

S. Fetni et al. Materials & Design, 204, 2021, 2D case of 316L + WC

- TDMU collaboration (project EDPOMP)

→ Directed Energy Deposition: FEM & Deep Learning

T. Quy Duc Pham et al. ESAFORM proc. 2021 and Rice 2021



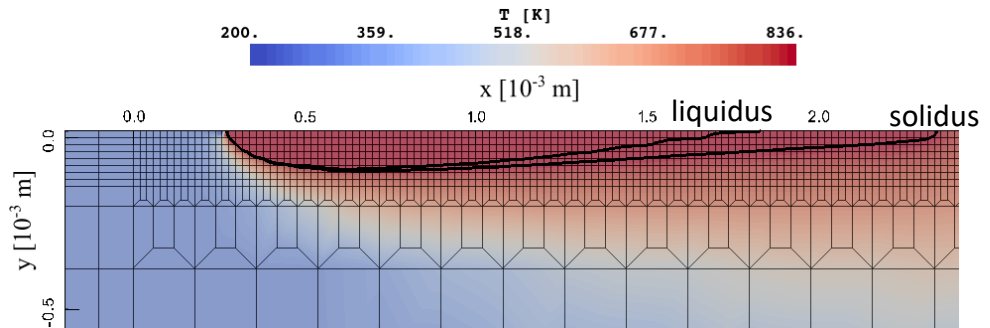
# FE thermal model applied on LPBF

- 2D model (no thermal flow in transversal direction, 1 track per layer)
- Birth element technique
- Solid model (no fluid movement, just by increased conductivity)
- **Laser absorptivity**, convection and radiation coefficients adjusted to recover: melt pool size & cell size
- Material data: Heat capacity  $c_p$  and conduction  $k$
- Mesh convergence studied

→ Temperature history  
for each material point

→ Melt pool depth and width

Thermal finite elements model of LPBF  
[PhD Delahaye unpublished results 21]



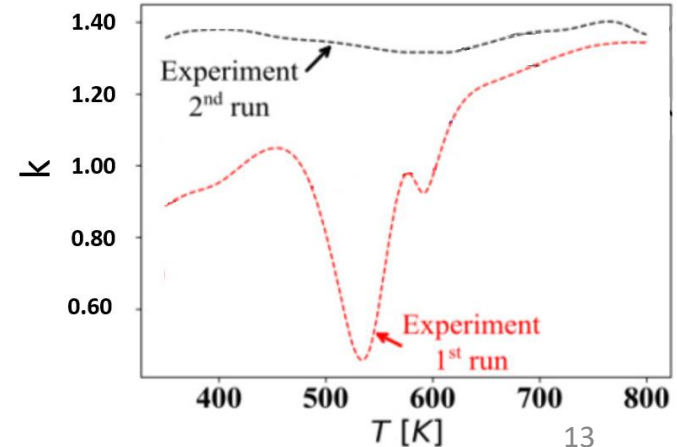
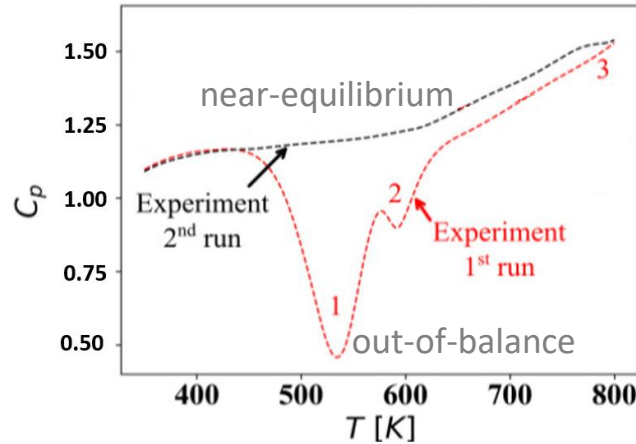
# Input Material data



- $c_p$  and conduction  $k$  measured on LBFP samples
- **BUT** differential scanning calorimetry (DSC) measurement = bad 'twin'

Cooling / heating rate:  $10^6$  K.s<sup>-1</sup> for LPBF  $\neq$  1.7 K.s<sup>-1</sup> for DSC

1. B atoms from sur saturated solution diffuse to B precipitates
2. B precipitates growth
3. Walls dissolve





# Model improvement?

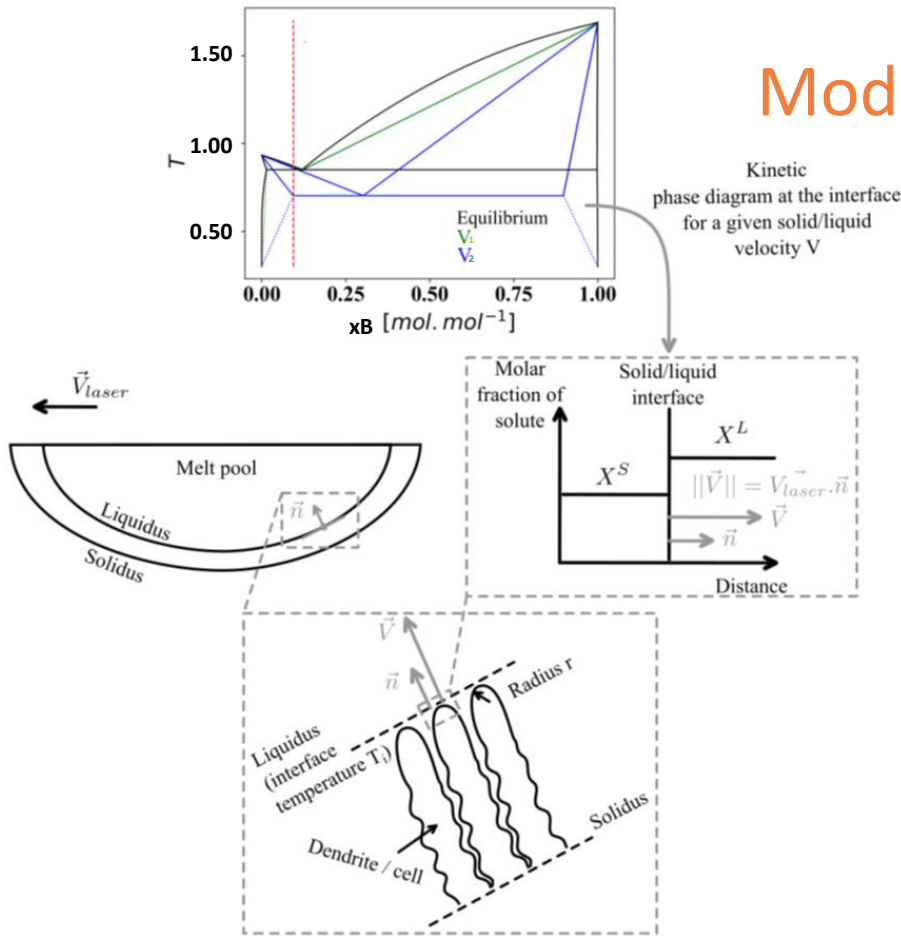
Instantaneous  $c_p$  and  $k$  computed on real temperature history

## 4 Different models

1. Calphad approach (A-B equilibrium phase diagram)
2. Calphad apparent (Diagram shifted: heat absorbed by dissolution of 'wall')
3. New implemented model with kinetic effect of liquid solid interface & Sur saturation due to the high cooling rate in LPBF
4. Post processing of microstructure result of Phase Field simulation



# Model 3: Conductivity model



- microstructure AB in equilibrium
- microstructure AB out of balance (sur saturation of B in A solid solution)

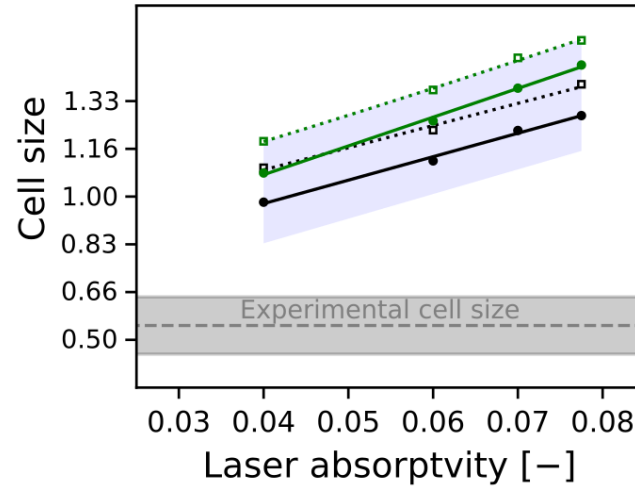
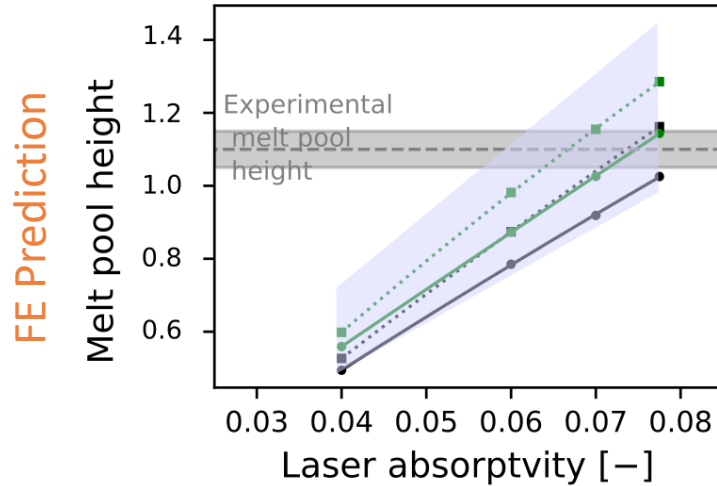
- Dendrite growth model under non equilibrium conditions
- no diffusion in solid
- Infinite diffusion in liquid

R. Trivedi and W. Kurz, Dendritic growth, International Materials Reviews 341 39 (2) (1994)  
 w. J. BOETTINGER, S. R. CORIELL, and R. TRIVEDI: 'Fourth conf. on rapid solidification 13; 1988, Baton Rouge, LA, Claitor's Publishing Division.



# FE simulation sensitivity

For fixed convection & radiation coefficient,  
Identified laser absorptivity highly depends on input data



## FE Assumptions

$c_p$  and  $k$

Shaded zone:  
Calphad or new

DSC experiment

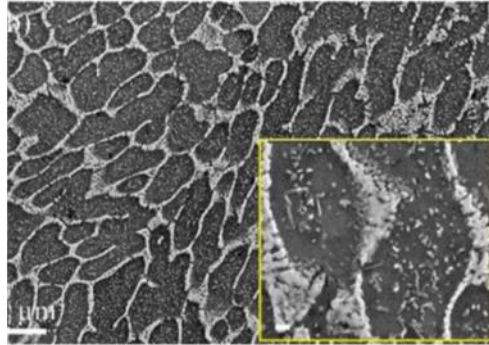
— 1st Run  
— 2nd Run

... Marangoni  
 $k \times 2$

Why ? 2D FE assumption + *Marangoni* not accurate

(*liquid convection generated by variable surface tension in the melt pool*)





As built

## Phase Field Model

Predict microstructure evolution

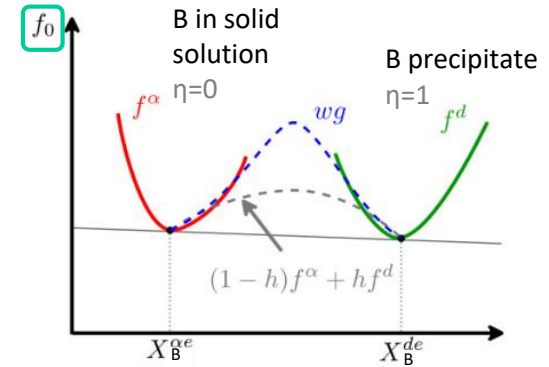


After post processing

# Phase Field Model description (1/4)

## Free energy formulation

- Kim Kim Suzuki model to compute the phase  $\eta$
- Interface considered as mixture of both phases A and B with the same chemical potential



Non-homogeneous free energy

Average molar volume

Molar fraction of B in A

Phase

Temperature

Homogeneous free energy density

Interface contribution

Elastic strain energy

$$\mathcal{F} = \langle V_m \rangle \int_V f_0(X_B, \eta, T) + \frac{\kappa^2}{2} (\nabla \eta)^2 + e_{el} dV$$

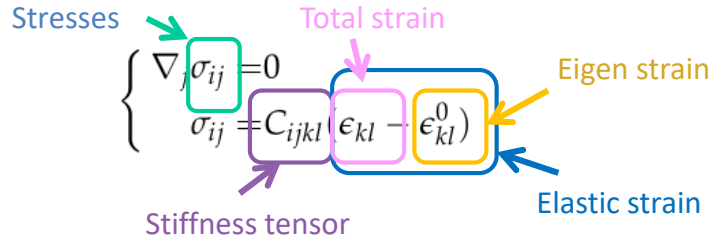
$$f_0(X_B, \eta, T) = \frac{1}{\langle V_m \rangle} [(1 - h(\eta)) f^\alpha(X_B, T) + h(\eta) f^d(X_B, T) + wg(\eta)]$$

Interpolation function

Double-well potential function of height  $w$

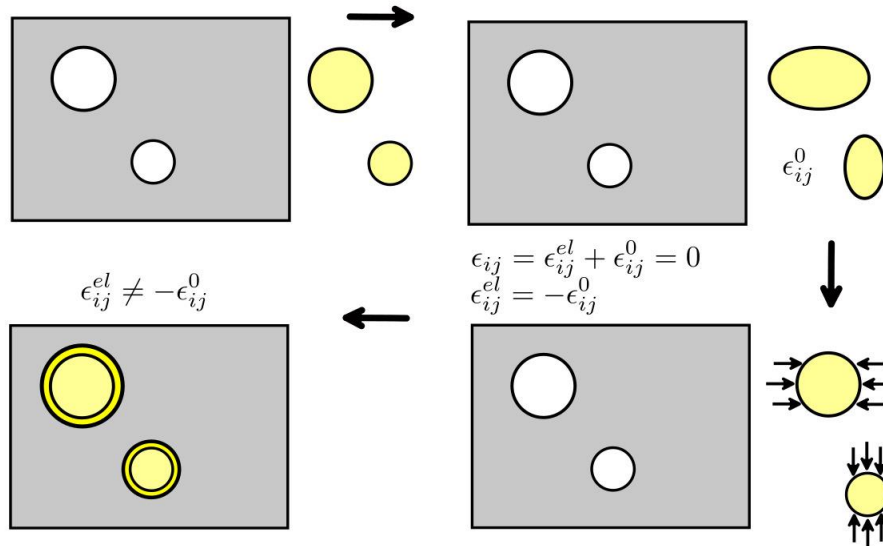
# Phase Field Model description (2/4)

## Elastic strain energy



$$e_{el} = \frac{1}{2} C_{ijkl} (\epsilon_{ij} - \epsilon_{ij}^0) (\epsilon_{kl} - \epsilon_{kl}^0)$$

A. Khachaturyan,  
Theory of Structural  
Transformations in  
Solids, 1983.



# Phase Field Model description (3/4)

## Enhanced diffusion by quenched-in vacancies

Modified impurity diffusion coefficient of B in A

$$*D_B^A = \left( \frac{X_{Va}}{X_{Va}^e} \right) *D_{0B}^A \exp\left(-\frac{Q^* D_B^A}{RT}\right)$$

Original impurity diffusion coefficient of B in A

Molar fraction of B in A matrix

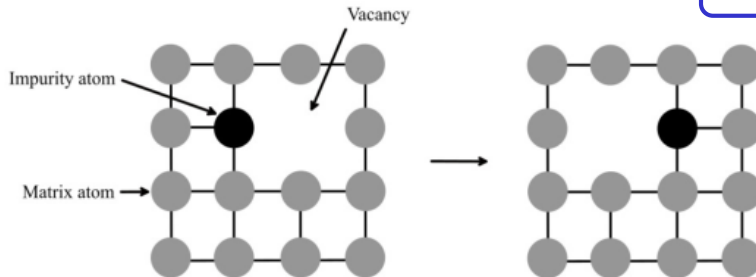
Non-equilibrium vacancy site fraction

Vacancy diffusion coefficient

Temperature (time)

Self-diffusion coefficient of Al

$$X_{Va}(t+dt) = X_{Va}(t) + \left[ 1 - \exp\left(-\frac{D_{Va}}{L_{Va}} dt\right) \right] \left[ X_{Va}^e(T(t)) - X_{Va}(t) \right]$$



Vacancy site fraction at equilibrium

Mean vacancy diffusion path

A. Falahati, et al. , IJMR 101 (2010) 1089–1096.

# Phase Field Model description (4/4)

## Governing equations

- Cahn-Hilliard for conserved field (A and B quantity)
- Allen-Cahn for non-conserved field (phase  $\eta$ )
- Solved by Fourier spectral methods

A/B Inter-diffusivity

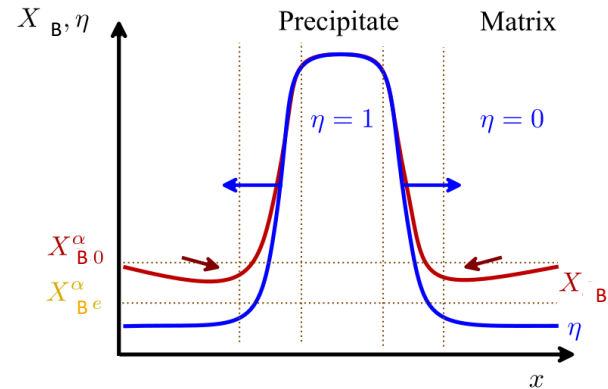
↓

$$\frac{\partial X_B}{\partial t} = \nabla \cdot \left( \frac{\tilde{D}}{\partial^2 f_0 / \partial X_B^2} \nabla \frac{\delta \mathcal{F}}{\delta X_B} \right)$$

Interface kinetic coefficient

↓

$$\frac{\partial \eta}{\partial t} = -L \frac{\delta \mathcal{F}}{\delta \eta}$$

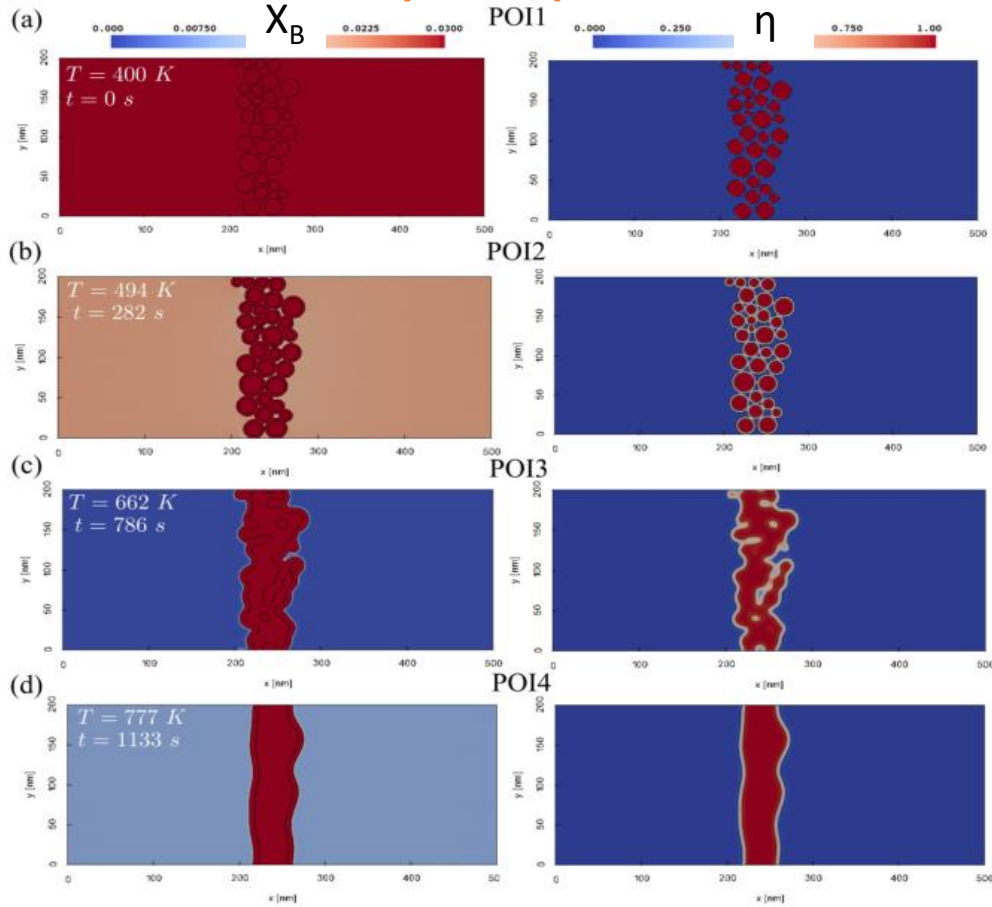


# Phase Field Model input

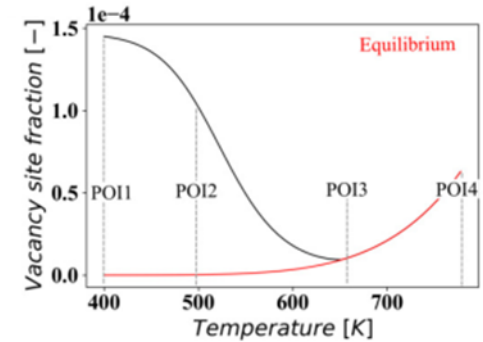
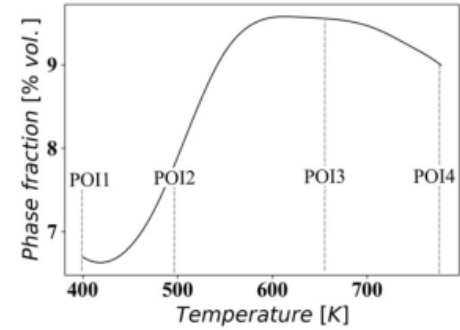
Model parameter	Symbol	Simplification	Tool / experiment	Reference
Free energy density	$f^\alpha, f^d$	Parabola fitting	CALPHAD modeling	[ANS98]
A/B Inter-diffusivity	$\tilde{D}$	A/B Impurity diffusion coefficient		[Man+09]
A Self-diffusivity	* $D_A^A$			[Man+09]
Interfacial mobility	$M_\eta$		DSC experiment	No published yet
A/B interface energy	$\gamma$		Back calculation from nucleation rate experiment	[ROS58]
Initial conditions (phase fraction and molar fraction of B)	$\eta^0, X_B^0$		XRD + SEM analysis	No published yet
Molar volume	$V_m$		CALPHAD modeling	[Hal07]
Stiffness tensor	$C_{ijkl}$	Use A value for the whole system	CALPHAD modeling	[Su+15]
Equilibrium vacancy site fraction	$X_{Va}^e$			[Meh07]

Ansara, et al. , COST 507 - Definition of Thermochemical and Thermophysical Properties to Provide a Database for the Development of New Light Alloys, 1998.  
 Mehrer, Diffusion in Solids: Fundamentals, Methods, Materials, Diffusion-Controlled Processes, Springer Science & Business Media, 2007. Rosenbaum, D.  
 Turnbull, Acta Metallurgica 6 (1958) 653–659. D. Su, et al. ICISMME, 2015. Hallstedt, Calphad 31 (2007) 292–302.  
 Mantina, et al. , Acta Materialia 57 (2009) 4102–4108

# Phase Field simulation of a rich eutectic zone with B precipitates within a matrix A

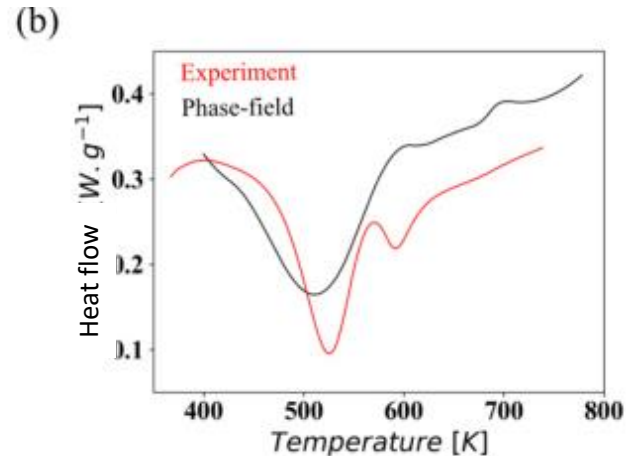
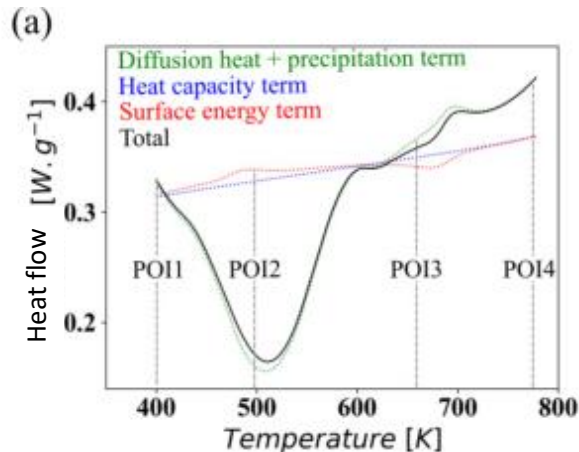


for a heating rate of 20 K/min



# Validation on experimental DSC curve

- First peak (desaturation of A matrix with B) well simulated
  - Second peak (B precipitate coarsening) shifted to high temperature
    - need to tune model input parameters
- 4<sup>th</sup> model for predicting DSC and deriving  $c_p$  and  $k$





# Conclusion

## On the way

- ❖ FE improvement (Marangony and 3D) : 2D FE partially validated
- ❖ Phase Field simulations (time step) → microstructure for LPBF:  
Computations validated on DSC
- ➡ Data Bases
- ➡ Deep Learning ↘ CPU
- ➡ Process and post process optimization to reach ideal microstructure
- ❖ Final Microstructure → Final properties  
HAZ thickness explains fracture strains



Thank you for your attention  
Questions ?

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