



LIÈGE université  
Sciences Appliquées



# Méthodes numériques pour la simulation des procédés

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Colloque Aussois 2024 de l'association MECAMAT  
Cours du lundi 22 01 2024 sur invitation



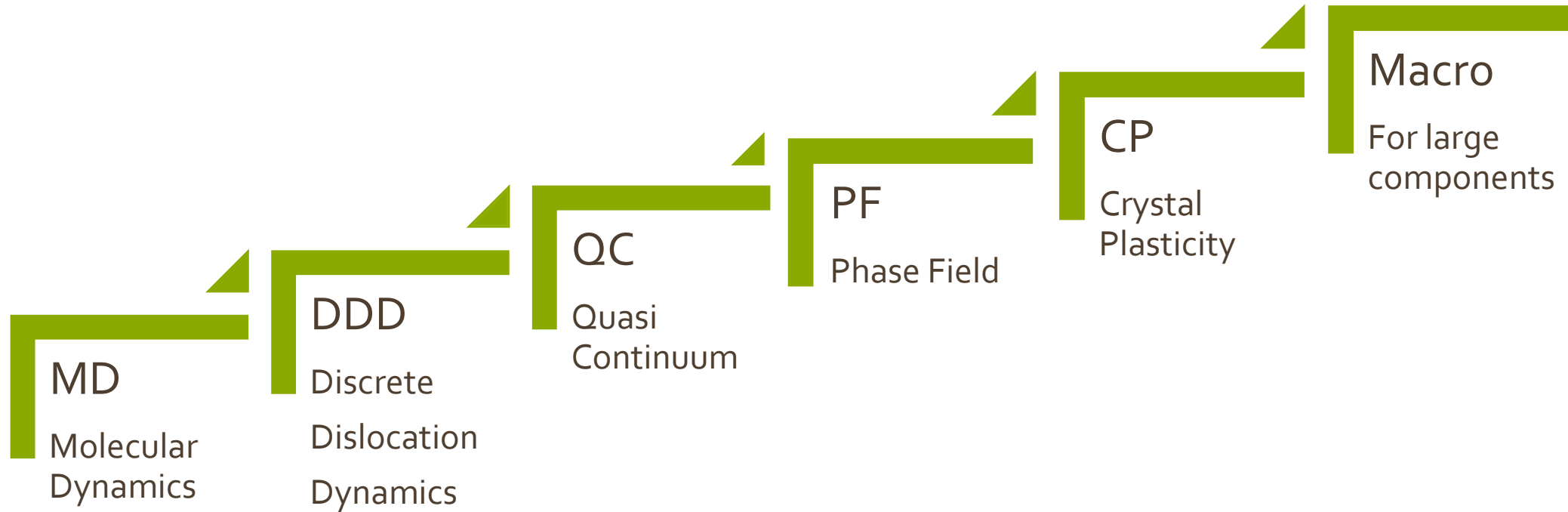
# Contents

- A survey of scales and methods
- Finite element method FEM
  - One element: Solid Shell
  - Mechanical constitutive laws
    - Deep Drawing
  - Thermo-mechanical analysis
    - Cooling of rolling mills
    - Continuous casting
  - Representative Volume Element (RVE) or [in French VER](#)
- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning
  - Additive Manufacturing

What are the **important phenomena** in your process ? What are their **scales**?

What is your access to software and to skilled scientists? Which time for training?

Which data are available?



# MD - Molecular Dynamics

## Basic principles

Particle (often individual atom)  
motion - computation

Forces on atoms: derivatives of  
analytic equations defining **potentials**

-Bimolecular (biology) –a few  
biomolecules, very large time

-Materials (engineer)  $\rightarrow 10^9$  atoms or  
coarse grains “meso scale”,  
& time  $\mu$ s or max s

## Interests - Limits

LAMMPS open code

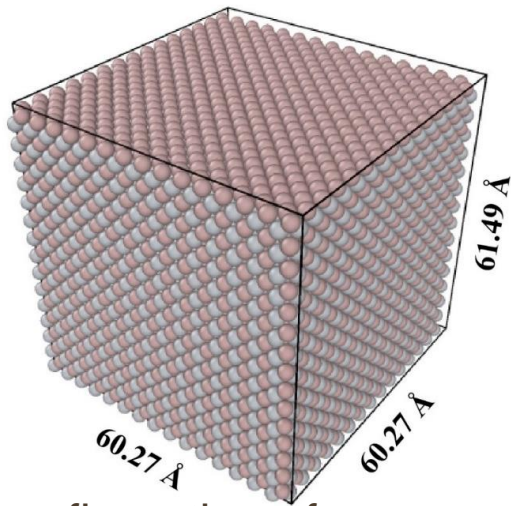
To compute for instance heat conductance,  
stress –strain curve in single crystals  
at different tps°

To observe GB effect of simple systems  
nm scale

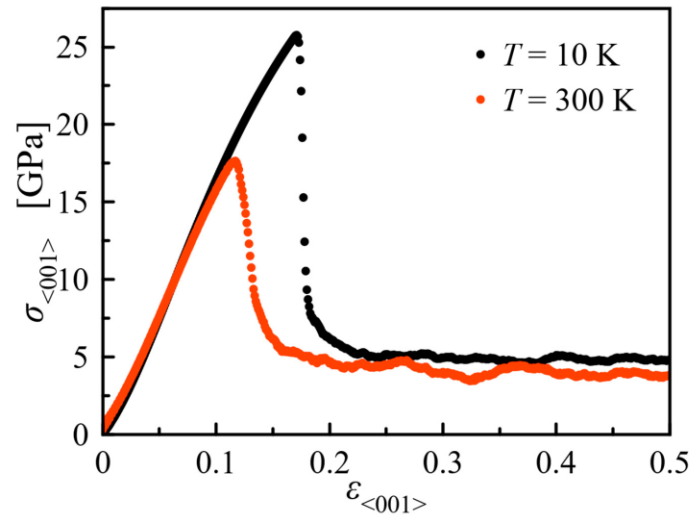
Not for studying polycrystalline materials  
with porosities, precipitates...  
or just one aspect at local scale,

Clear interest in material design  
« 1st step of manufacturing process »





Initial configuration of TiAl alloy.  
 Gray balls = Ti atoms  
 Pink balls = Al atoms,

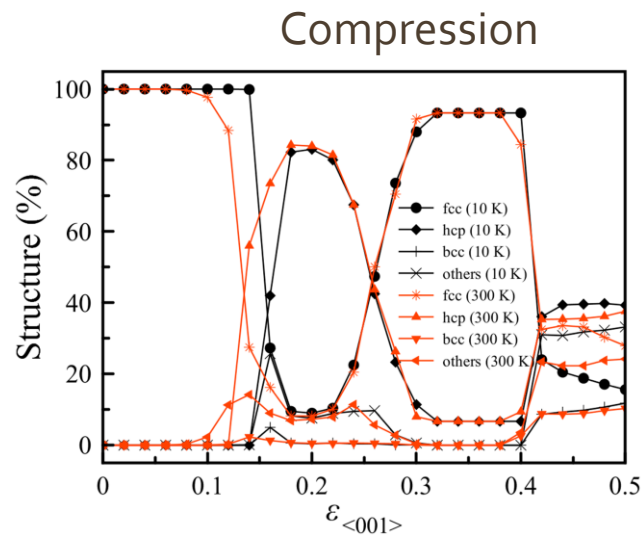
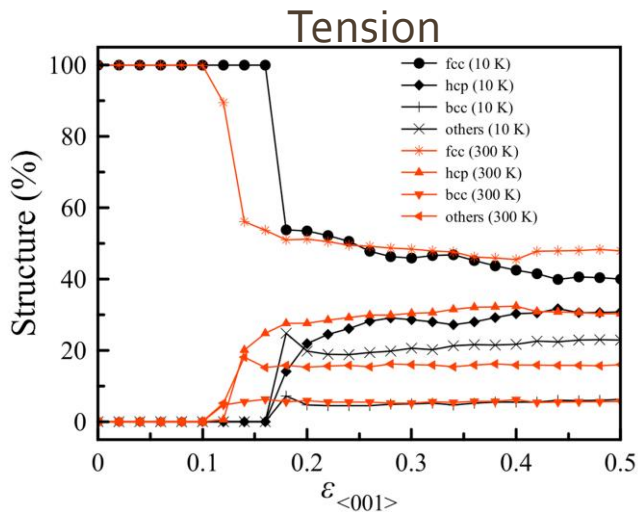


Uniaxial tensile loading of TiAl alloy in the  $\langle 001 \rangle$  dir.

To predict of the **differential effect** in tension and compression known in TiAl

To relate it to phase changes  
 FCC  $\rightarrow$  BCC and HCP at different moment and % according tension, compression,  $tp^\circ$

Experimental Young modulus: well predicted



Arifin, R. et al. *Metals* 2021, 11, 1760.

# MD - Molecular Dynamics - References

LAMMPS -a flexible simulation tool for particle-based materials modeling at the atomic, meso, and continuum scales **A. P. Thompson** et al. *Computer Physics Communications* 271 (2022) 108171  
<https://doi.org/10.1016/j.cpc.2021.108171>

Principle, code feature

Structural Change of TiAl Alloy under Uniaxial Tension and Compression in the <001> Direction: A Molecular Dynamics Study **Arifin, R.** et al. *Metals* 2021, 11, 1760. <https://doi.org/10.3390/met11111760>

Stress differential effect phase change

Molecular Dynamics Simulations Correlating Mechanical Property Changes of Alumina with Atomic Voids under Triaxial Tension Loading. Modelling Chang, J et al. 2023, 4, 211–223.  
<https://doi.org/10.3390/modelling4020012>

Rupture of alumina

MEAM potentials for Al, Si, Mg, Cu, and Fe alloys B. Jelinek et al.  
[arXiv:1107.0544](https://arxiv.org/abs/1107.0544) [cond-mat.mtrl-sci]

Potentials for Al, Si, Mg, Cu, Fe interactions

# DDD - Discrete Dislocation Dynamics

## Basic principles

forces on dislocations

-> dislocation stress field computed

-> dislocation movement integrated

-> contact reactions

2D OK to investigate

but 3DDD for quantitative simulations

## Interests - Limits

To predict plastic material behavior

At mesoscopic scale (1  $\mu\text{m}$  to 100  $\mu\text{m}$ )

Increased complexity:

anisotropic elastic media

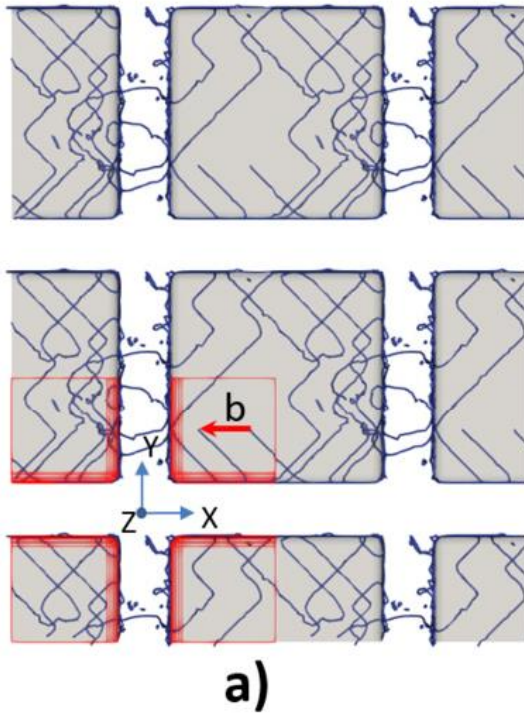
large strains, plastic distortions

microstructure evolution

(-> coupling with Phase Field)

More about material property prediction than process modeling but of course linked.

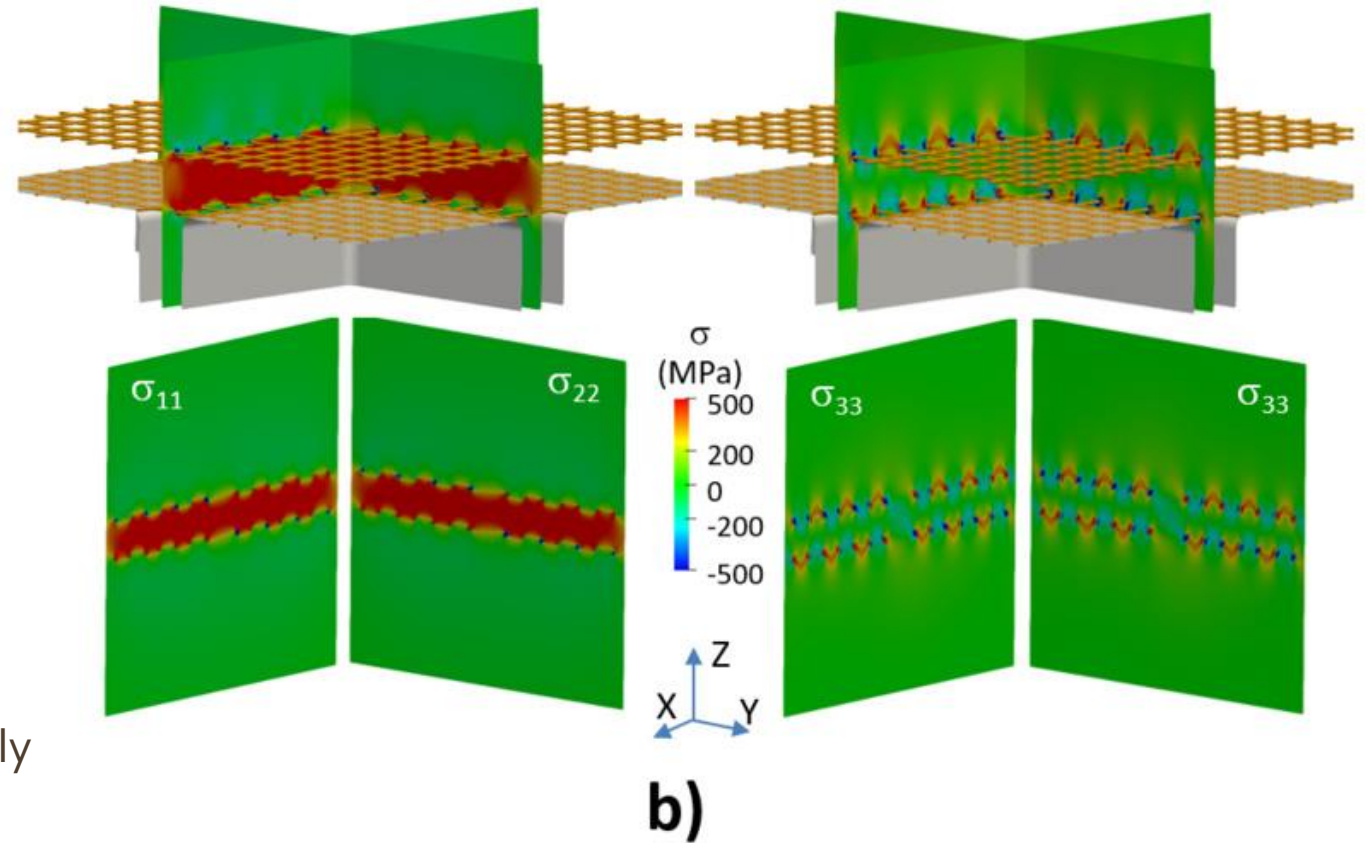
# DDD - Discrete Dislocation Dynamics - Creep



The 3  $\gamma$  channels of the superalloys: not mechanically equivalent for the dislocation dynamics

Ni based superalloys

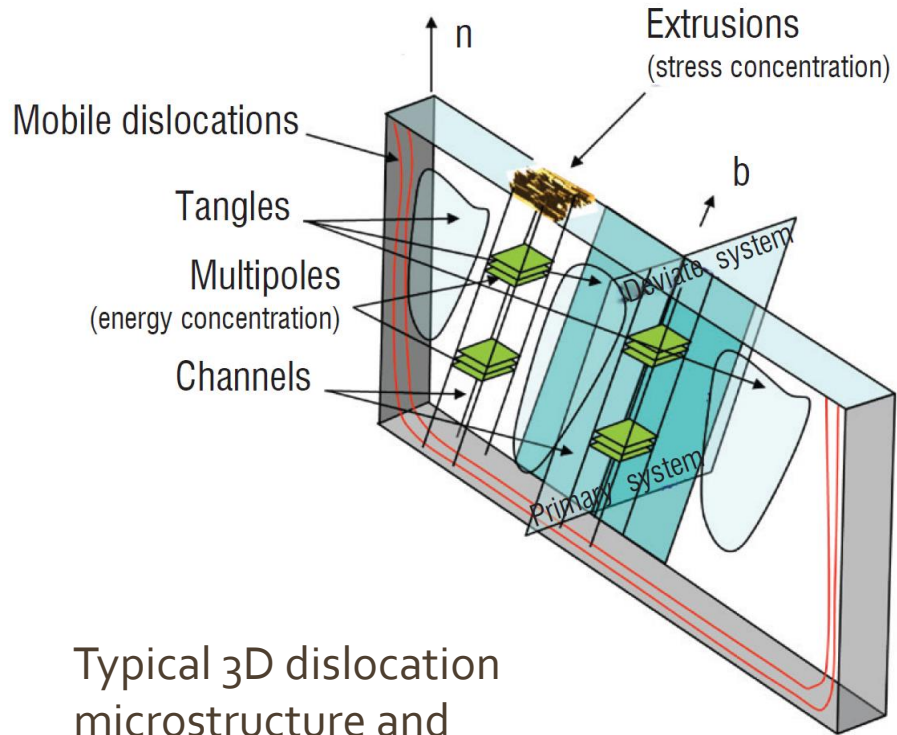
Chang et al. IJP 2018



Dislocations induce a 2D plane stress elastic state  
→ contraction along the loading direction

*Results of 3D edge-screw model*  
*TRIDIS*

# DDD - Discrete Dislocation Dynamics - Fatigue



Typical 3D dislocation microstructure and description of a single slip band

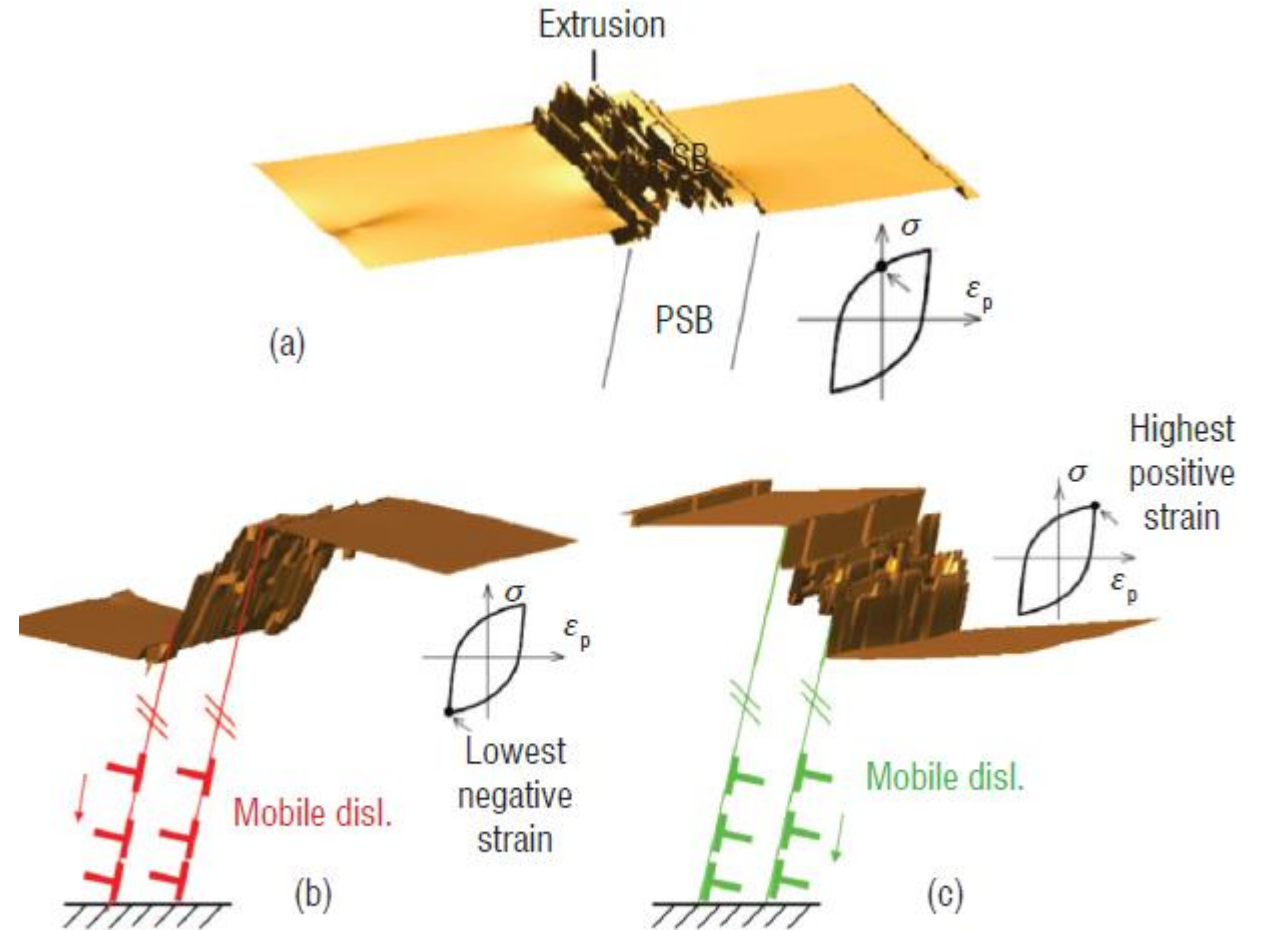
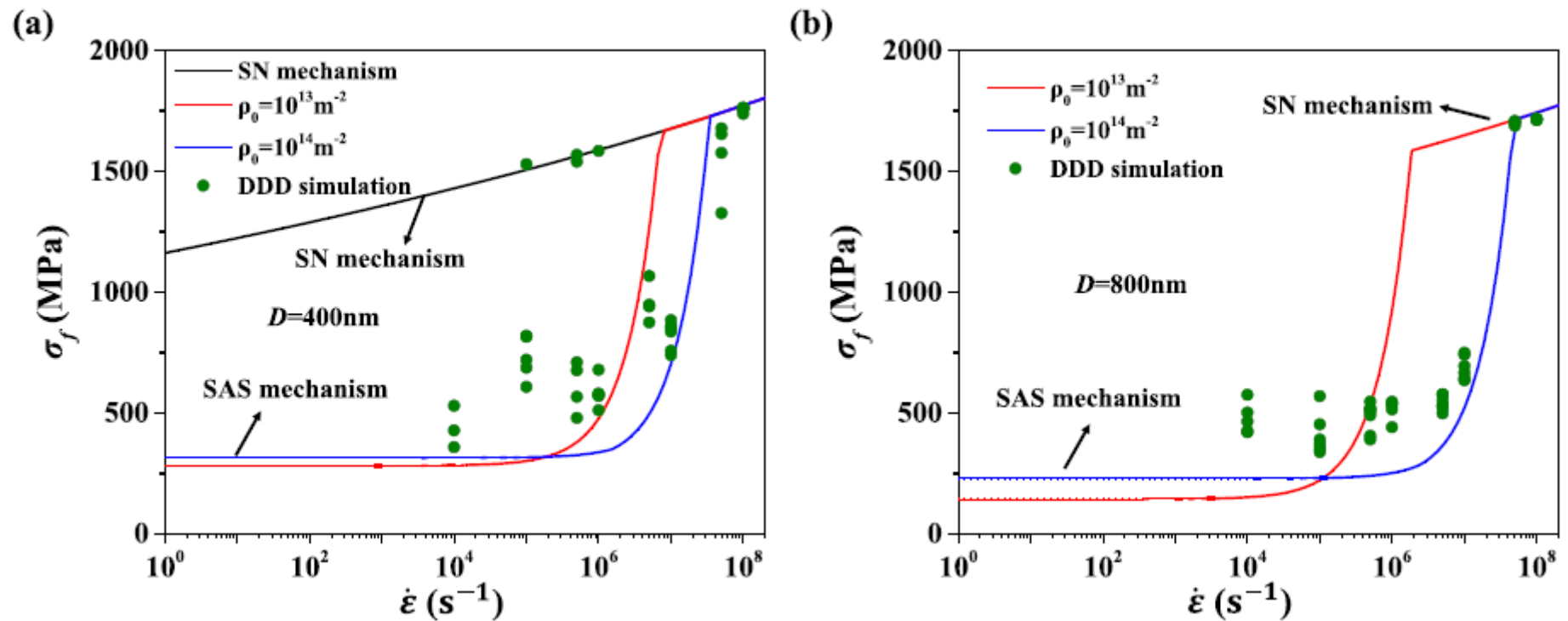


Figure 3 - Extrusion at the surface plotted for different instant of a given cycle



# DDD - Discrete Dislocation Dynamics - Stress- Strain Curve

J. Hu et al.  
*Sci Rep* 9, 20422 (2019)



Prediction of micro Cu pillars behavior with different initial dislocation densities used to fit analytical models linked with mechanisms (curves)

For small pillars with diameter  $< 200\text{ nm}$  main plastic deformation mechanism = “surface nucleation” (SN)

For samples on the sub-micrometer scale, nucleation happens rather by so-called “single-arm sources” (SAS), i.e. a dislocation segment which is pinned inside the sample that terminates on the sample surface.



# DDD - Discrete Dislocation Dynamics - References

Discrete dislocation dynamics **F. Bioli et al.** in *Nickel Base Single Crystals Across Length Scales 2022 Elsevier*

<https://doi.org/10.1016/B978-0-12-819357-0.00021-4>

Principle, code feature, application Ni alloys

Influence of Excess Volumes Induced by Re and W on Dislocation Motion and Creep in Ni-Base Single Crystal Superalloys: A 3D Discrete Dislocation Dynamics Study **S. Gao et al.** *Metals* 2019, 9, 637;

<https://www.mdpi.com/2075-4701/9/6/637>

Creep application

3D Discrete Dislocation Dynamics Investigations of Fatigue Crack Initiation and Propagation-Life Prediction Methodologies for Materials and Structures **C. Déprés et al.** *Aerospacelab Journal Issue 9 - June 2015*

[https://aerospacelab.onera.fr/sites/w3.onera.fr.aerospacelab/files/ALog-01\\_1.pdf](https://aerospacelab.onera.fr/sites/w3.onera.fr.aerospacelab/files/ALog-01_1.pdf)

Fatigue application

Predicting the flow stress and dominant yielding mechanisms: analytical models based on discrete dislocation plasticity **J. Hu et al.** *Sci Rep* 9, 20422 (2019).

<https://www.nature.com/articles/s41598-019-56252-x>

Dominant yielding mechanisms single crystalline copper pillars

Dirk Raabe Research Unit website

<https://www.dierk-raabe.com/ddd-discrete-dislocation-dynamics/>

Course, video, indentation, large strain, BG penetration see many ref. Articles

# QC- QuasiContinuum

## Basic principles

Adaptive mesh « model » refinement :

Energy must be minimized but is computed

- by full atomistic modeling in regions of the problem
- by continuum assumptions elsewhere

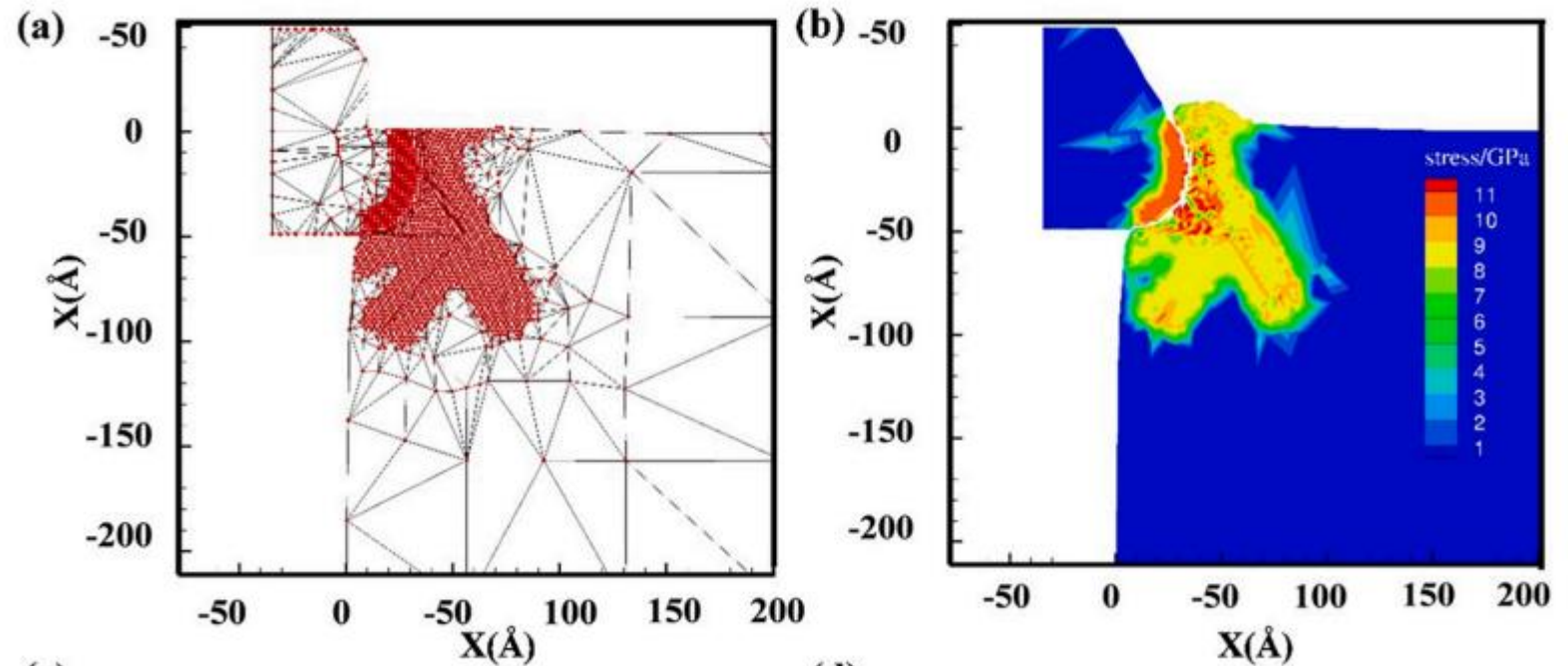
## Interest and drawbacks / process

Methods to address larger problems

MEMS failure through fracture and fatigue processes

Cutting models in microforming-->  
we arrive to « process modeling »

# QC- QuasiContinuum - Applications - Nano cutting



Optimized QC method

the material removal function is added,

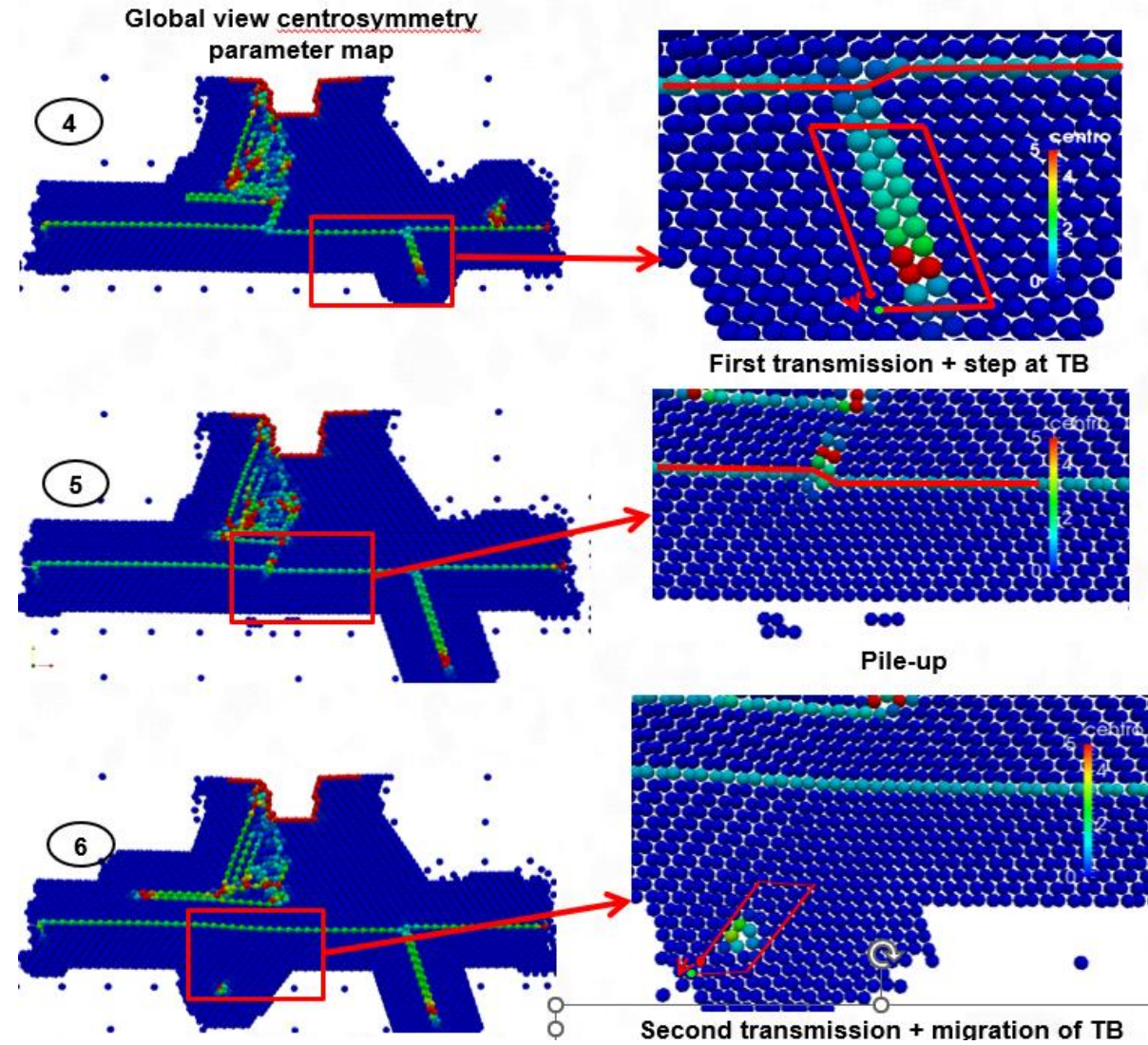
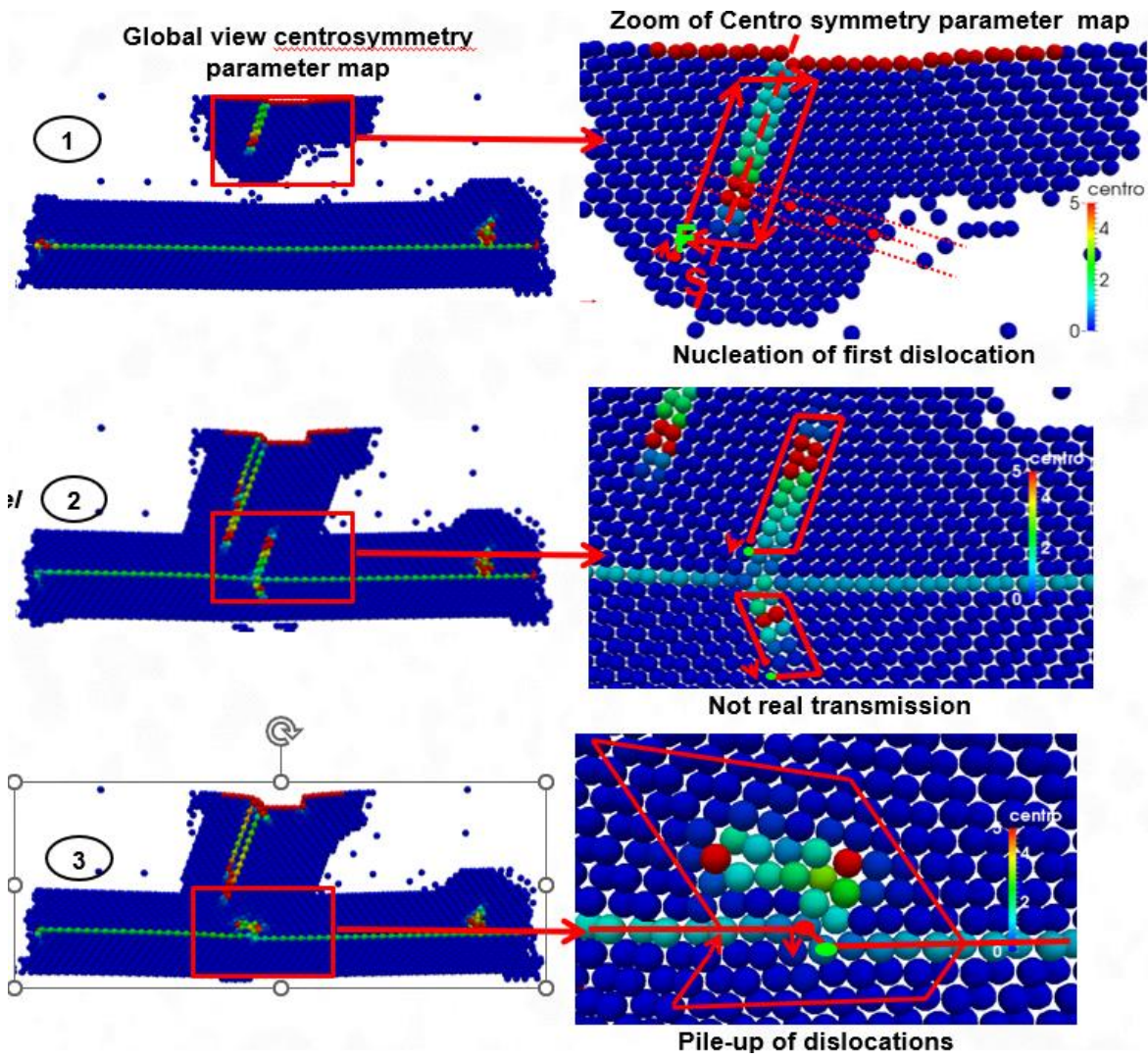
Methods avoids unreasonable lattice excessive distortion, studies « large-area », deep dislocation slip.

→ Influence of the cutting depth, tool angle, rounded tool cutting edge radius  
on the cutting force applied to a single-crystal copper workpiece

Yang et al. J Mat Processing 2021



# QC- QuasiContinuum - Applications - Fundamental Science



Can a Dislocation cross a Coherent Twin Grain Boundary in copper ?

Tran Hoang Son et al ESAFORM 2017

# QC- QuasiContinuum - References

The Quasicontinuum Method: Overview, applications and current directions **Miller, R.E., Tadmor, E.** *Journal of Computer-Aided Materials Design* **9**, 203–239 (2002). <https://doi.org/10.1023/A:1026098010127>

The Theory and Implementation of the Quasicontinuum Method. **Tadmor, E.B., Miller, R.E.** (2005). *In: Yip, S. (eds) Handbook of Materials Modeling. Springer, Dordrecht.* [https://doi.org/10.1007/978-1-4020-3286-8\\_34](https://doi.org/10.1007/978-1-4020-3286-8_34)

Principle, code feature

Free access to the code - tutorial - references see <http://qcmethod.org/documentation>

Open code feature + a community exchange platform

Multi-scale numerical analysis and experimental verification for nano-cutting **S. M. Yang, et al.** *Journal of Manufacturing Processes*, **71**, 260-268 (2021)

<https://doi.org/10.1016/j.jmapro.2021.09.030>

Cutting application

# PF - Phase Field

## Basic principles

Thermodynamic approach

**Phase**  $\eta_i$  Liquid, Solid, Eutectic, Dendrite, Precipitate, Solid-Solution, Grain 1, Grain 2, ... Grain n (microstructure related info)

**Variable** associated to each phase: concentration  $c_i$ , density, ... (phase feature related info)

Smooth **interface between phases** with finite widths (solid-solid, solid-liquid ...)

Computation of System Energy,

microstructure evolution is the result of energy minimization

## Interests Limits

Generic method

Solidification, sintering, crack nucleation and propagation, phase transformation, ...

Open source code available

Data base available Calphad

Many parameters, energy functions to find

Request material scientist knowledge

CPU can be very long

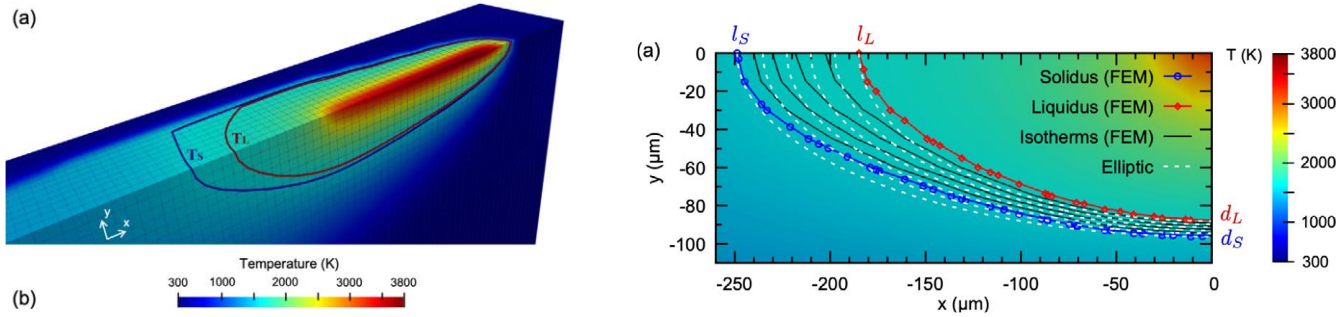
Nano to meso scale (grid  $\text{nm}^2$ , volume  $\text{nm}^3$ )

The conserved fields like  $c_i$  evolve with time according to Cahn–Hilliard equation

The non-conserved fields ( $\eta_i$ ) are governed by the Allen–Cahn equation

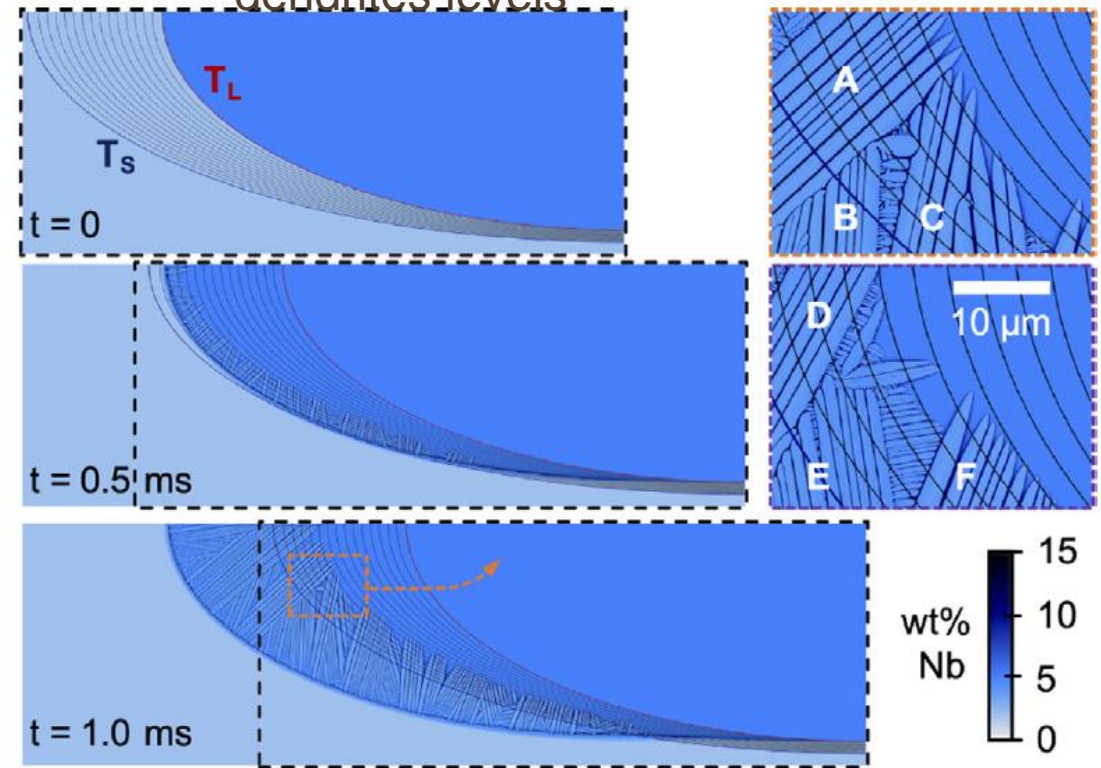
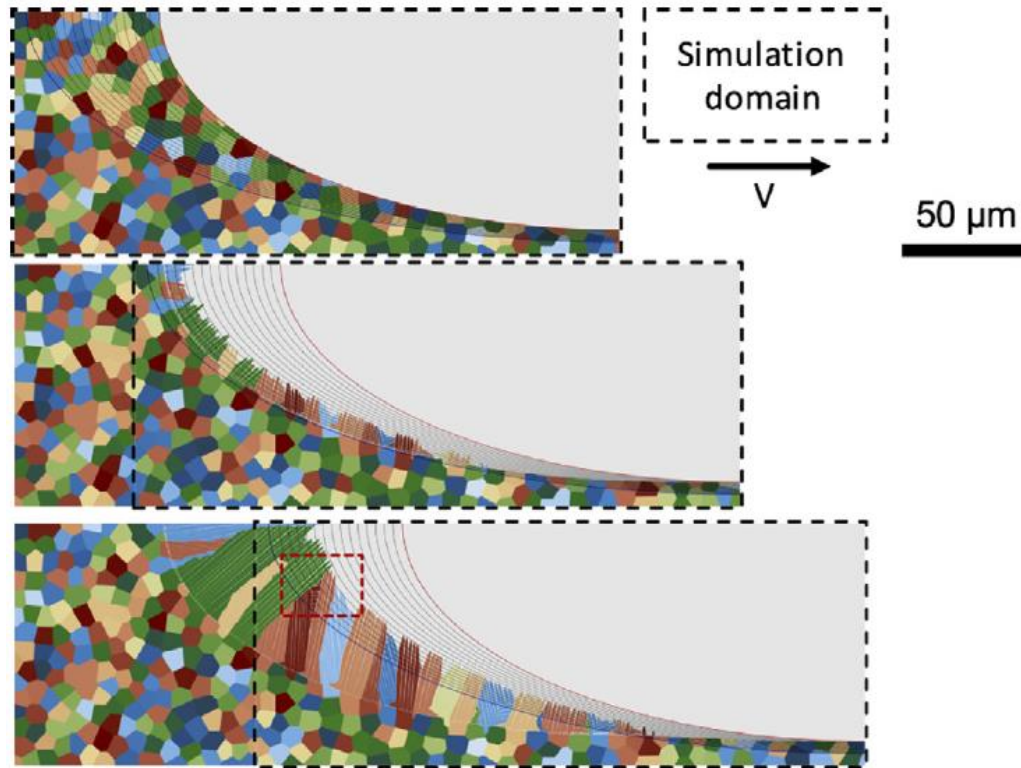


# PF - Phase Field - Applications LPBF: FEM + PF



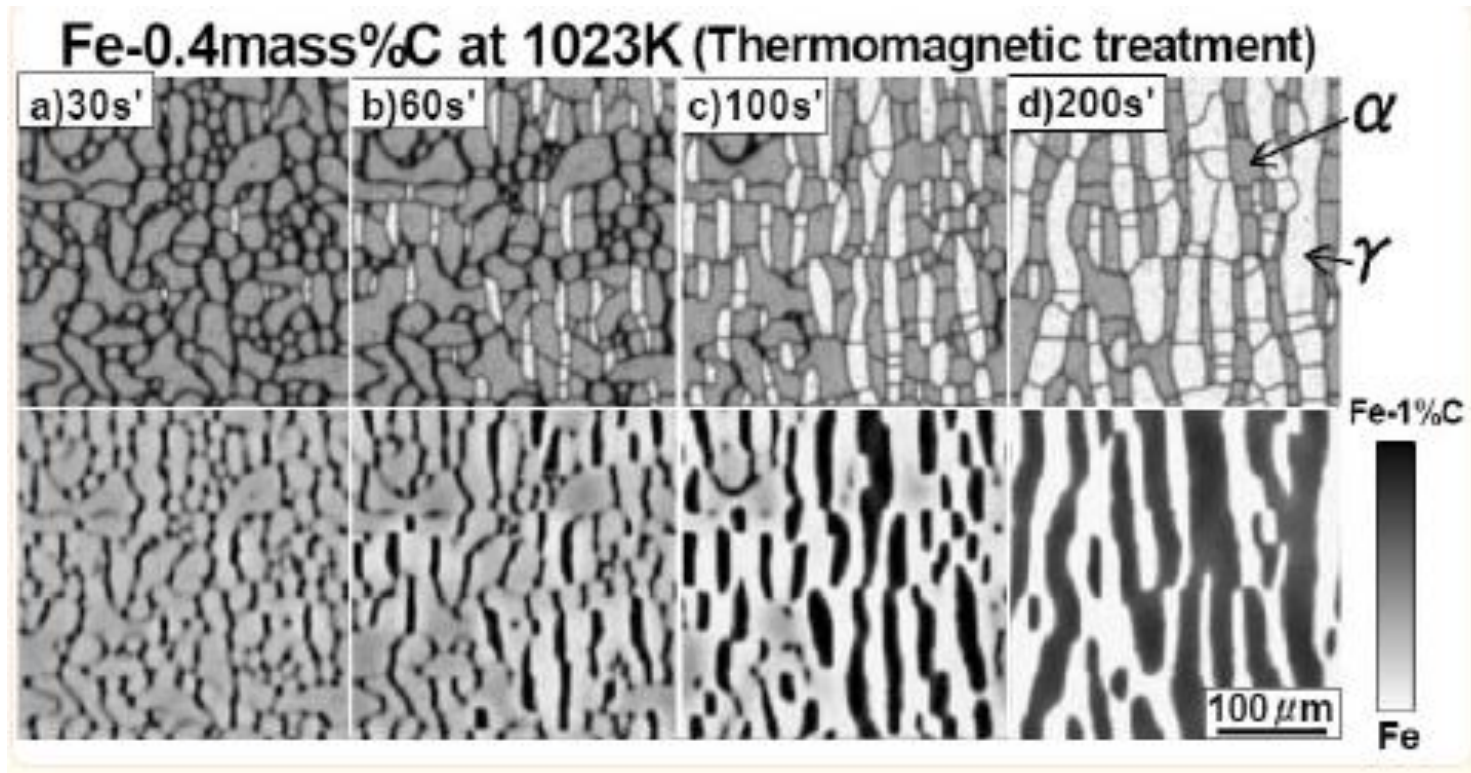
FEM thermal simulations of the material addition and fusion,  
PF simulations of solidification in the melt pool.

Inconel 718 grain texture via polycrystalline growth competition under at individual dendrites levels



Elah et al. Computational Material Science 2022

# PF - Phase Field – Applications- Phase Transformation



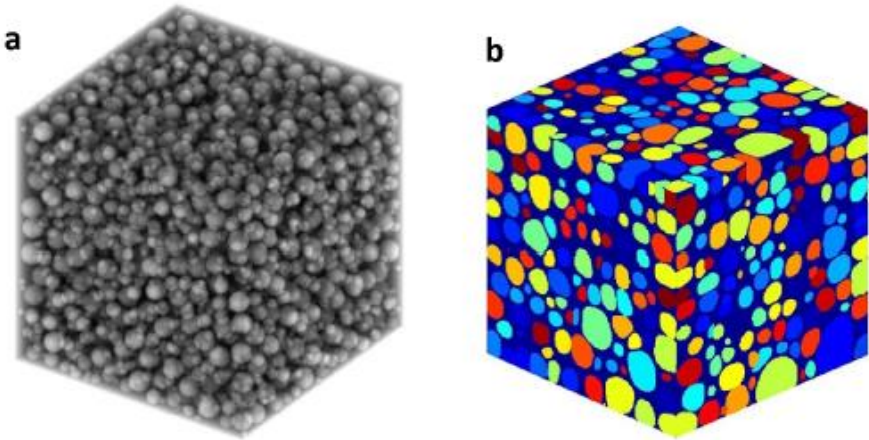
Phase-field modeling of microstructure evolutions in magnetic materials

[Toshiyuki Koyama](#)

2D PF simulation of phase transformation and microstructure development in Fe-0.4 mass%C at 1023 K with external magnetic field along vertical direction



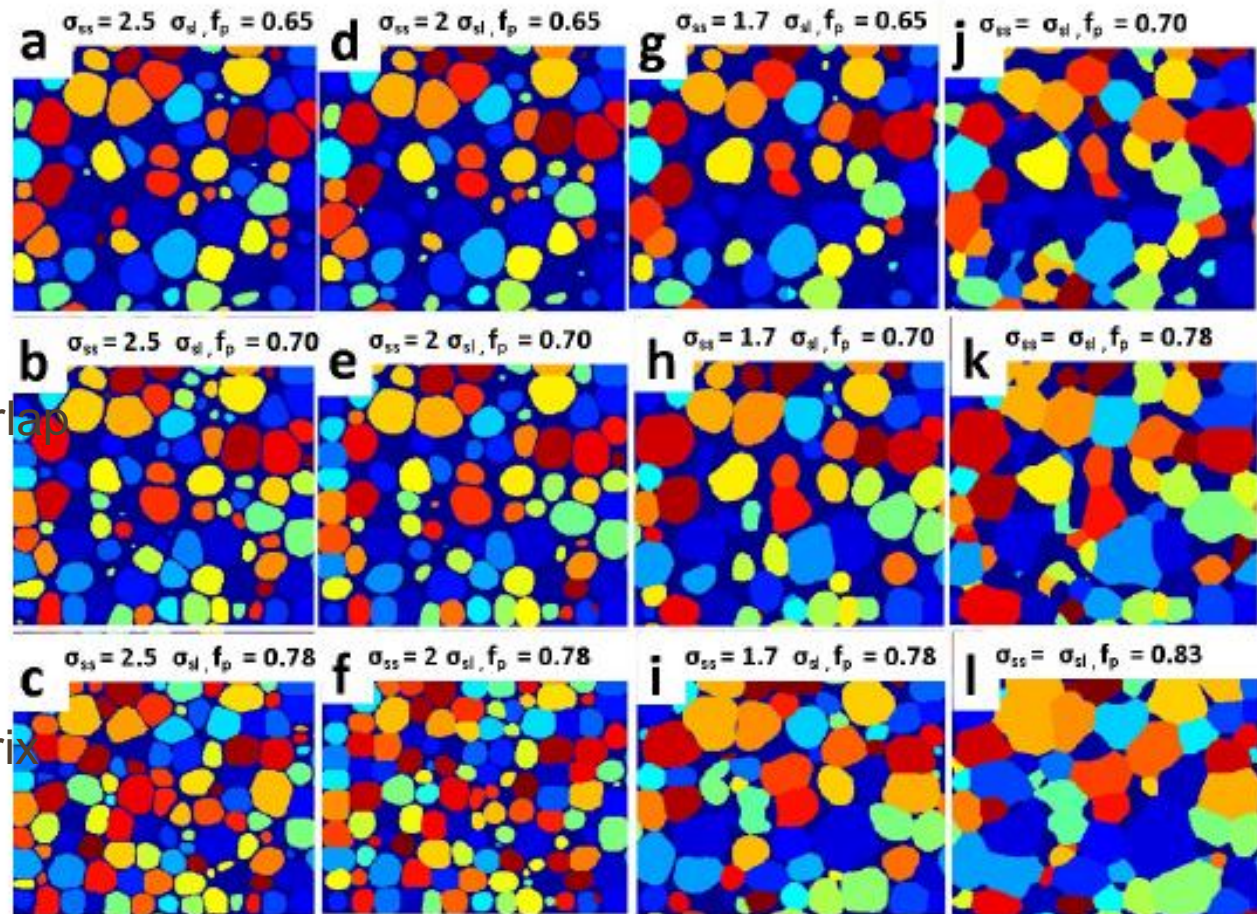
# PF - Phase Field - Applications Sintering



5000 solid particles randomly placed without overlap

## Liquid Sintering model

From fully connected grain structures with liquid pockets at the grain junctions to individual grains fully wetted by the liquid matrix



Simulations: sensitivity analysis

- solid-solid grain boundary energies/solid-liquid interface energies ratios [1 -2.5]
- particle volume fraction  $f_p$  and [0.65 -0.83]

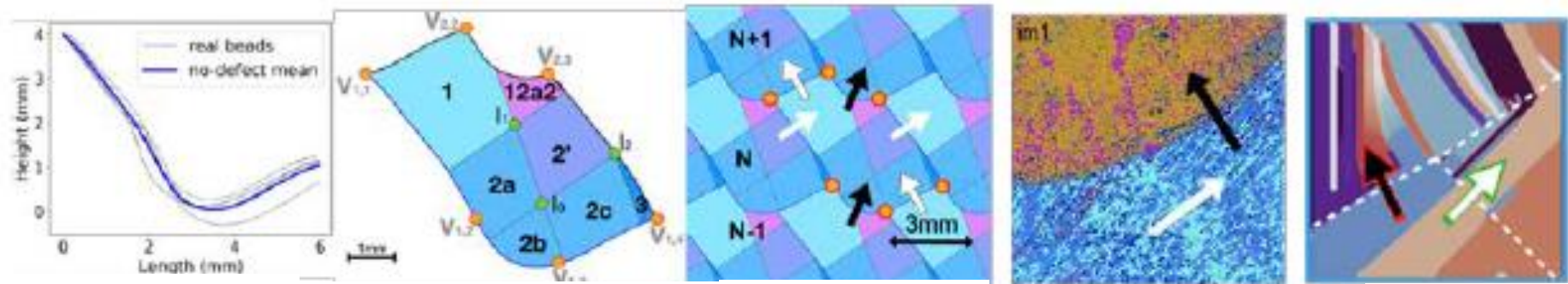
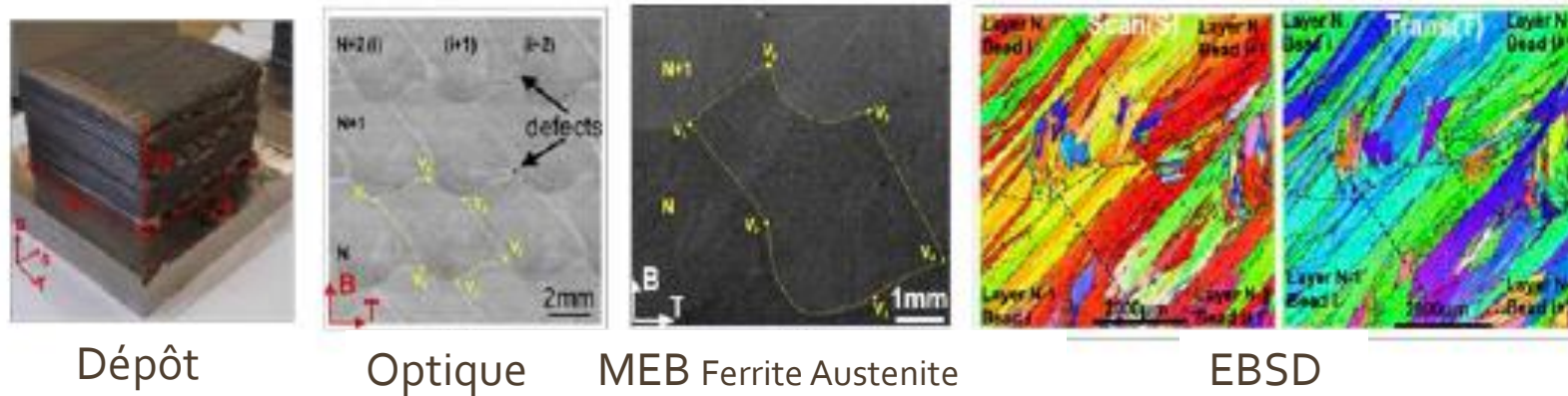
Ravash, H. *et al.* Europ. J. Ceramic Soc. 2017



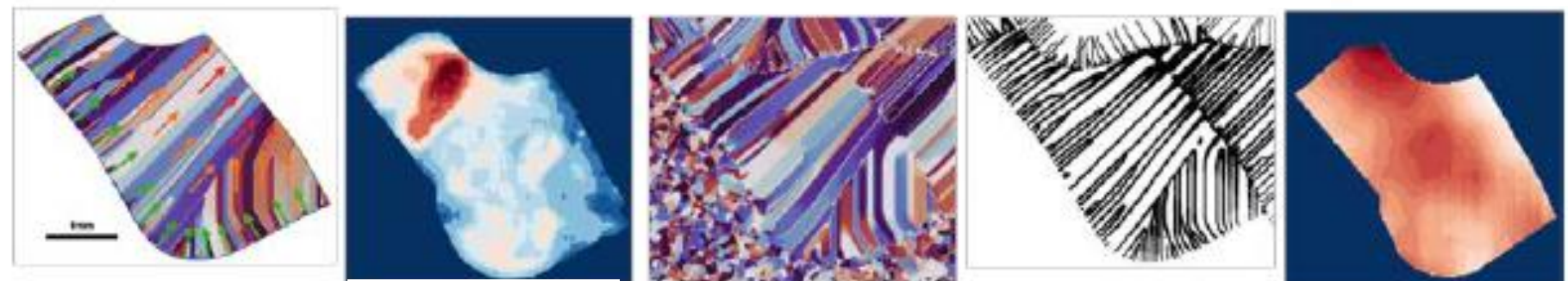
Ready to use  
different scales ?

Different  
experiments?

# 316L WAAM study



Modèle forme cordon    Zones orientation cristal.    Maillage 2D    Identif. Interface    Résultat PF continuité



Résultat PF orientation    Résultat IA Ferrite % via image MEB    Maillage complet PF    Résultat PF Ferrite % Maillage complet

PhD A. Herbeaux  
Saint Etienne  
14/02/2023  
Example of  
numerical &  
experimental  
work

# PF - Phase Field - References

Phase-Field Methods in Material Science and Engineering **N. Provatas and K. Elder** Wiley-VCH ed 2010

ISBN: 978-3-527-40747-7

An introduction to phase-field modeling of microstructure evolution **Moelans N. et al.** *Calphad - Computer Coupling of Phase Diagrams and Thermochemistry* 32 (2008)

Principle, Introduction

<https://doi.org/10.1016/j.calphad.2007.11.003>

Multiscale simulation of powder-bed fusion processing of metallic alloys **S.M. Elahi et al.** *Computational Materials Science* 209 (2022) 111383

Process simulation LPBF FEM + PF

<https://doi.org/10.1016/j.commatsci.2022.111383>

Three-dimensional phase-field study of grain coarsening and grain shape accommodation in the final stage of liquid-phase sintering. **Ravash, H. al.** *Journal of the European Ceramic Society*; 2017

<https://doi.org/10.1016/j.jeurceramsoc.2017.01.001>

Process simulation sintering

Phase-field modeling of microstructure evolutions in magnetic materials **Toshiyuki Komaya** *Sci Technol Adv Mater*

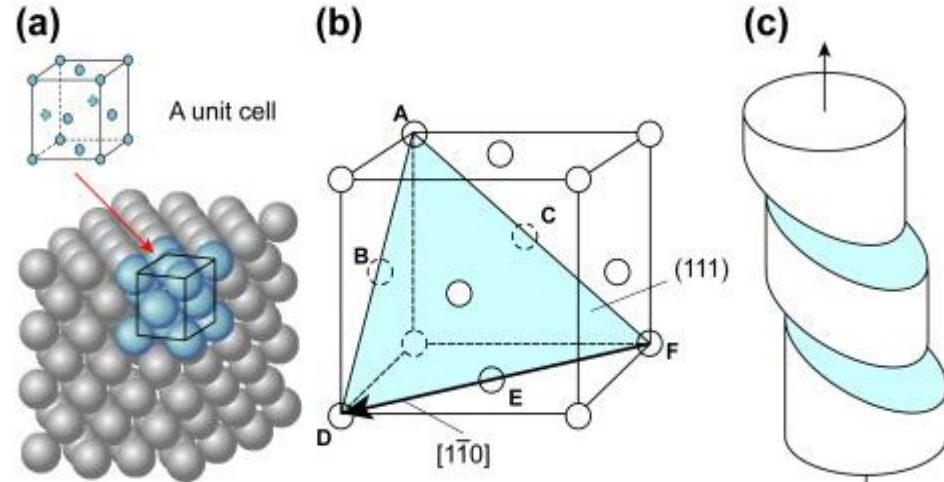
<https://doi.org/10.1088/1468-6996/9/1/013006>

Modeling Magnetic effect

# CP - Crystal Plasticity

## Basic principles

Dislocation slip computation in certain plane and direction due to a stress



- (a) Face-centered cubic (FCC)
- (b) a particular slip system (111)[110] ;
- (c) effect of single slip in a single crystal.

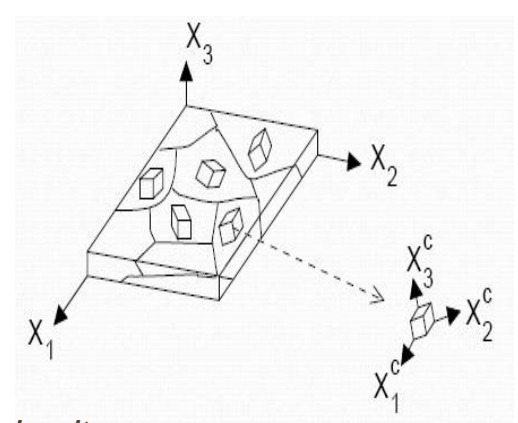
Slip Systems activated?

Notion of Critical Resolved Shear Stress reached

Or Viscoplasticity (easier)

Texture evolution due to crystal rotation under stress

Texture



## Interests Limits

Implemented in FEM (Finite Element Method)

Multiple commercial and academic softwares

either CPFEM (Material Science) or with a different Homogenization schemes → process models

Multiscale approach FE<sup>2</sup> and other ones → process models

Implemented FFT Fast Fourier Transformation

for cubic volume, periodic boundary conditions

→ material science

Open source software DAMASK (coupling FEM and FFT)

→ also adapted to handle process models

CP adapted for single and for polycrystals

CP applied for Metals but also Ice, ...

Focused on Large strain - Large deformation but linked with Elasticity



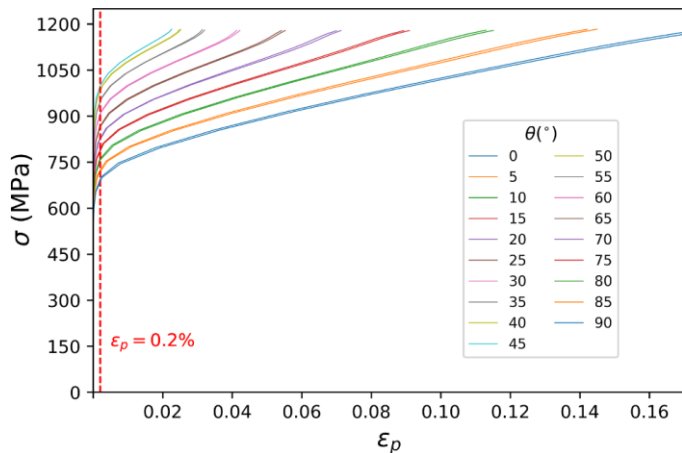
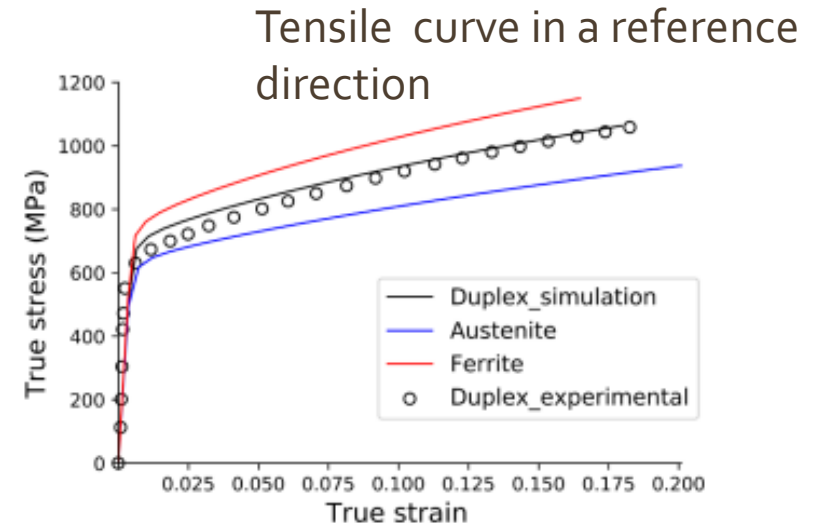
# CP - Crystal Plasticity – Applications - FEM



Representative Volume Element (RVE) synthetic microstructure.



Abaqus mesh:  
Austenite grains = Green,  
Ferrite ones = White

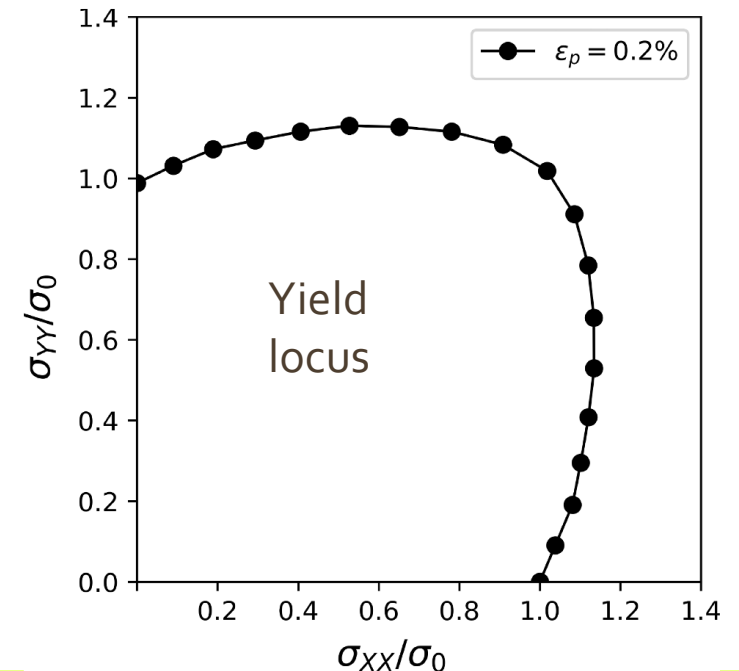


## What is called CPFEM

The homogenisation is done by the RVE itself

No assumption of total or partial equality in macro strain and micro strain

No loop on set of crystals for self consistent approach

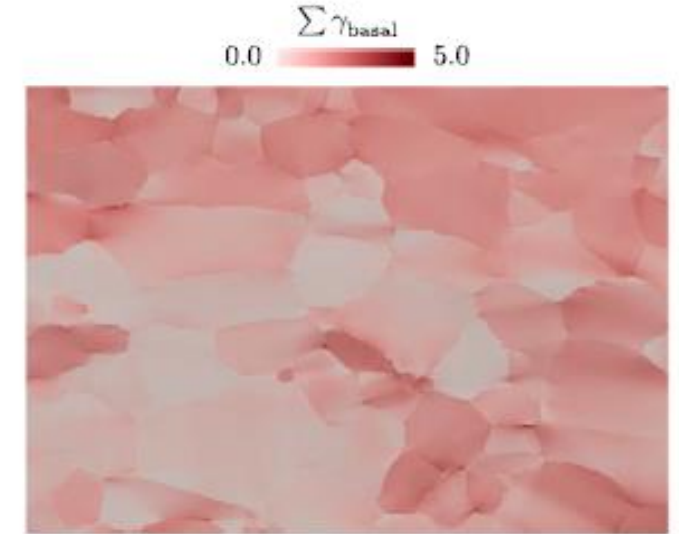


# CP - Crystal Plasticity – Applications - FFT

## DAMASK Flowchart



(a) Experimental result obtained by Electron Channeling Contrast Imaging (ECCI).



(b) Results of the Crystal Plasticity (CP) simulations: Magnitude of shear on all basal slip systems.

*$T_p^\circ$  dependent activation of twinning induced plasticity (TWIP) and transformation induced plasticity (TRIP) in high-Manganese steel (Fe-22Mn-0.6C)*

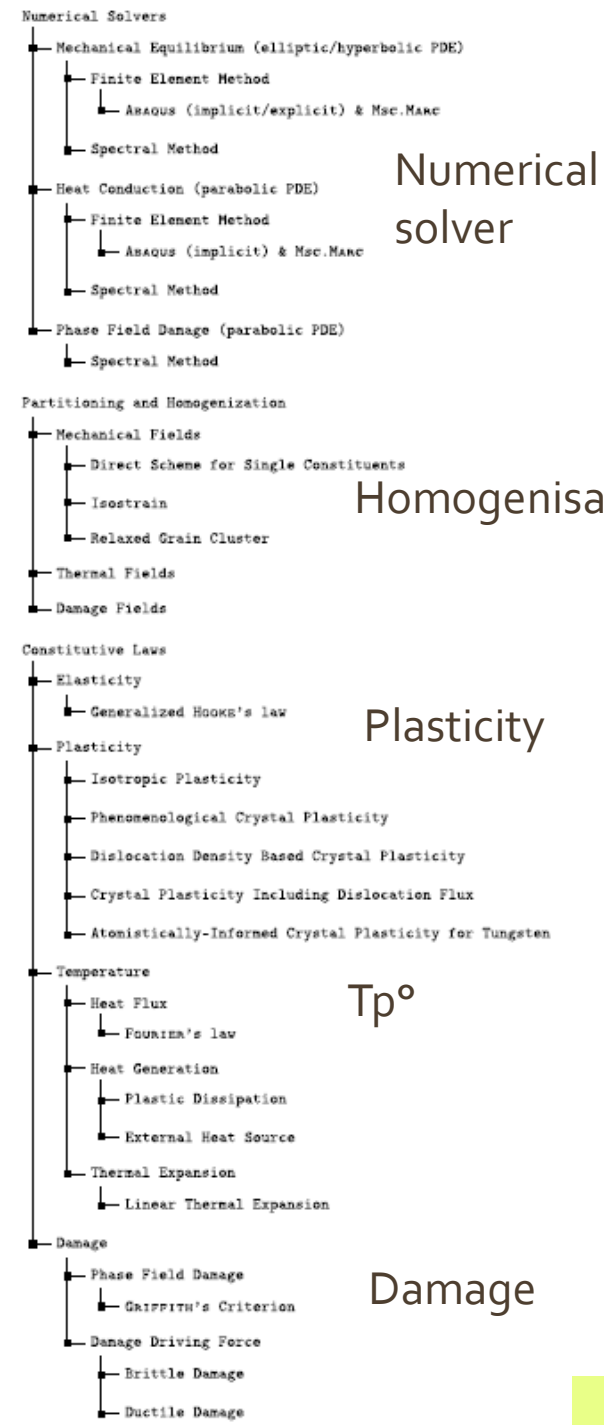
*RVE with FFT 100 grains + tensile experiments + different data bases (austenite, HCP phases) including thermodynamic ones*

*→ identification of TRIP/TWIP models*

*Results = Twin fraction, Martensite %, stress-strain curves predictions*

*This type of constitutive law can then be used in a thermomechanical process.*

A survey of scales and methods



# CP - Crystal Plasticity - References

Modeling in Crystal Plasticity: From Theory to Application **Weiling Wang, Wei Wen**, Encyclopedia of Materials: Metals and Alloys 2022

<https://doi.org/10.1016/B978-0-12-819726-4.00058-2>

Modelling the plastic anisotropy of metals. **Habraken, A.** *Archives of Computational Methods in Engineering*, 11, 3-96 (2004).

<https://doi.org/10.1007/BF02736210>

Principle, Introduction

Analysis of ESAFORM 2021 cup drawing benchmark of an Al alloy, critical factors for accuracy and efficiency of FE simulations. **Habraken et al.** *Int. J. Mat. For.*, 15 (5), 61.

<https://doi.org/10.1007/s12289-022-01672-w>

Homogenization for polycrystal

Multi-scale material modelling to predict the material anisotropy of multiphase steels **Ravi S.K. et al.** *Computational Materials Science*; 2019

<https://doi.org/10.1016/j.commatsci.2019.01.028>

Application in Deep Drawing

DAMASK – The Düsseldorf Advanced Material Simulation Kit for modeling multi-physics crystal plasticity, thermal, and damage phenomena from the single crystal up to the component scale **F. Roters et al.** *Computational Materials Science* 158 (2019) 420–478

<https://doi.org/10.1016/j.commatsci.2018.04.030>

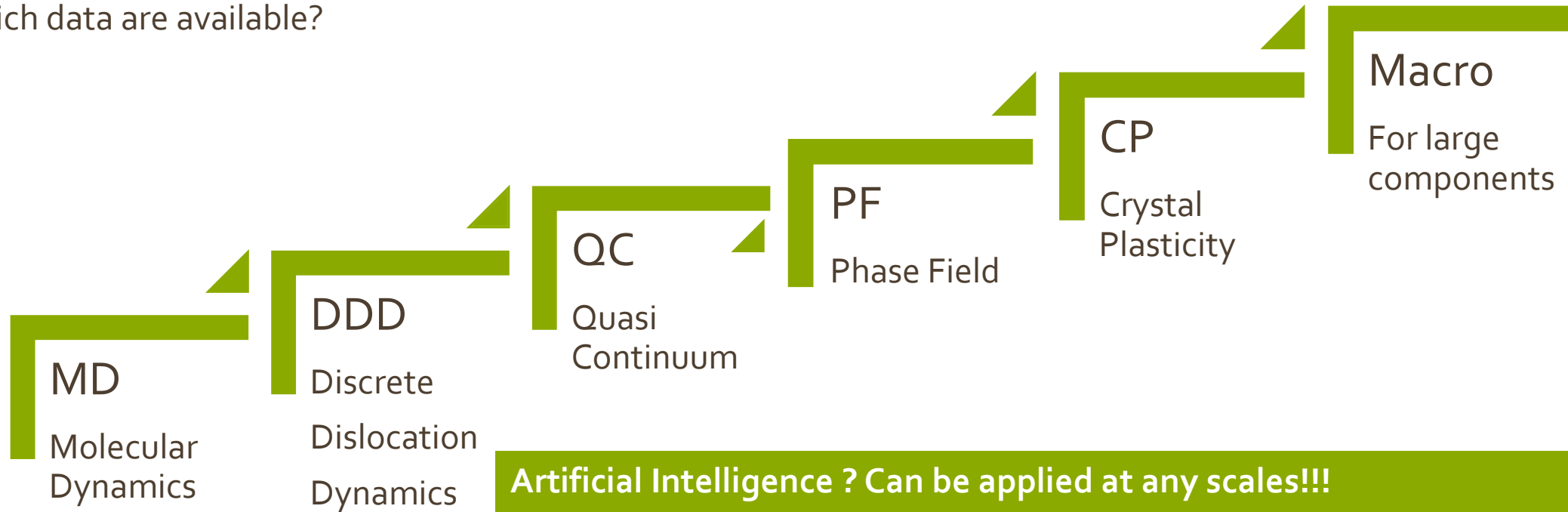
Multi physic software linking FEM and FFT

<https://damask.mpie.de/>

What are the **important phenomena** in your process ? What are their **scales**?

What is your access to software and to skilled scientists? Which time for training?

Which data are available?



### Artificial Intelligence ? Can be applied at any scales!!!

- Used to help to identify your models (post treatment of images, process data by multiple sensors, digitalize curves...)
- Trained by your complex constitutive laws → able to replace it?
- Trained on the “process parameters-final properties” link (measured or computed)

A. Tongne HDR-ENIT Tarbes ENIT, Chap 2, good introduction 8/2/2024

# Contents

✓ A survey of scales and methods

- Finite element method FEM

- One element: Solid Shell
- Mechanical constitutive laws (multi scale ?)
  - Deep Drawing
- Thermo-mechanical analysis
  - Cooling of rolling mills
  - Continuous casting

- Representative Volume Element (RVE) or in French VER

- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning
  - Additive Manufacturing

# Very Basic FEM Flowchart

Many choices if generic FE softwares

1. Analysis

Thermal, Mechanical, Metallurgical, Scale Macro or Micro

2. Level of coupling

Total, partial coupling or staggered (meeting points, different or similar meshes)

3. Boundary conditions

4. Mesh density, type of element and of constitutive laws

5. Solver

6. Iterative loop on equilibrium, energy balance, ...

7. Results to plot and check

Less choices if customized FE softwares

Still Researches with FEM ?

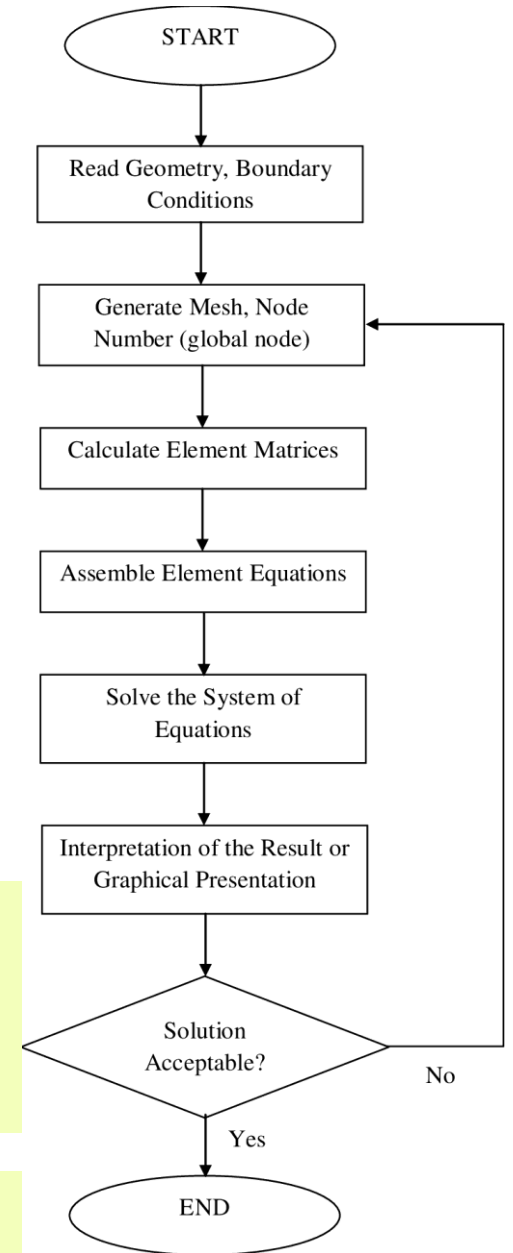
Element

Constitutive laws

Efficient computer sciences (solvers, coupling, pre and post processing...)

Alternatives:

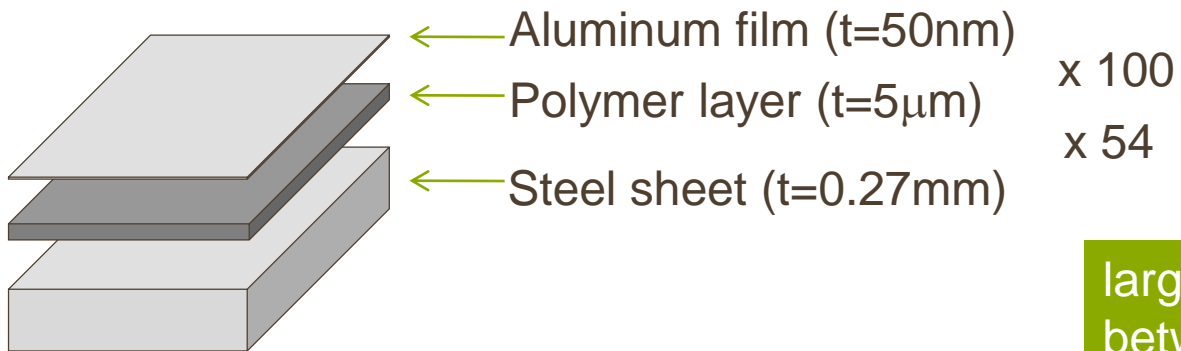
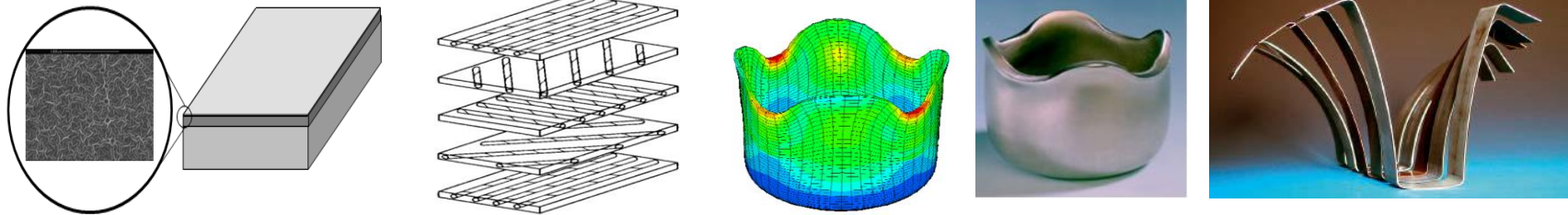
Meshless, Coupled Eulerian Lagrangian, Arbitrary Lagrangian Eulerian, Particle-FEM: PFEM, Artificial Intelligence (big family)





# FEM - A solid shell element... Why?

- Applications:**
- Thin structures
  - Multilayer materials: Coating , composite ...
  - Sheet metal forming, anisotropy, springback ...
  - Composites



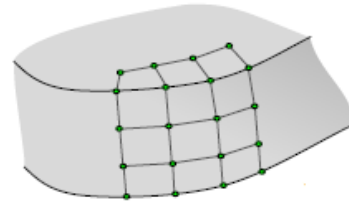
large incompatibilities  
between layer thicknesses

Poor behaviour  
of thin **Bulk element**  
with plane size/ thickness  $> 10$

Thickness, Through Thickness  
behavior in **Shell elements** ~~OK~~

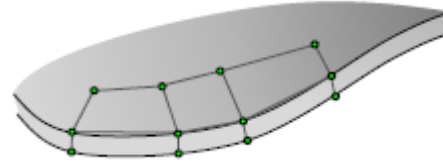
Crystal Plasticity  
= 3D constitutive law

# FEM - A solid shell element... What is it ?

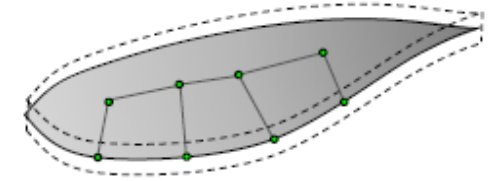


Solid

3 DOFs per node:  
3 Displacements



Solid-Shell



Shell

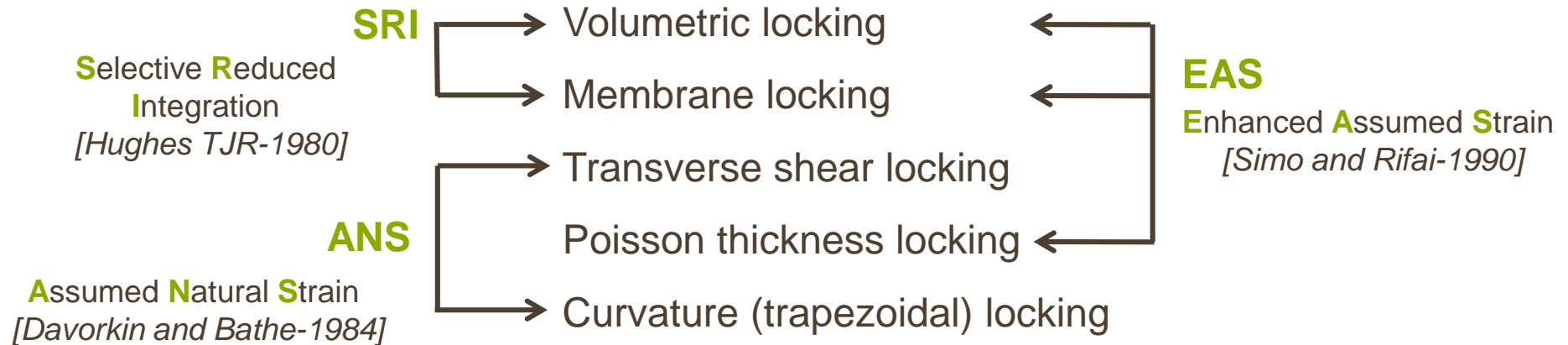
6 DOFs per node:  
3 Displacements  
3 Rotations

Due to their geometry, thin bulk solids have plenty of lockings → **special features of Solid Shell Solid Shell**

- ❖ Volumetric locking:
- ❖ Membrane locking
- ❖ Transverse shear locking
- ❖ Poisson thickness locking
- ❖ Curvature thickness (Trapezoidal) locking

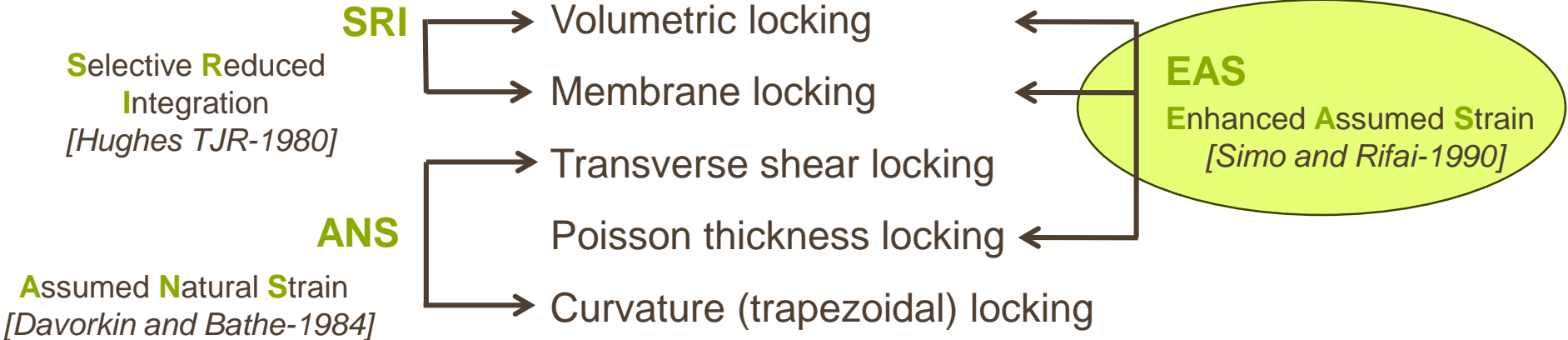
# FEM - A solid shell element...Features

- Some remedies for locking pathologies



# FEM - A solid shell element...Features

- Some remedies for locking pathologies





# FEM - A solid shell element... One variational principle choice

- The Hu-Washizu variational principle (3 unknown fields) :

Mech work equilibrium

$$\int_{\mathcal{B}} \nabla^s \underline{\eta} \cdot \underline{\sigma} dv - G_{ext}(\underline{\eta}) = 0$$

Strain field OK ?

$$\int_{\mathcal{B}} \underline{\tau} \cdot [\nabla^s \underline{\eta} - \underline{\varepsilon}] dv = 0$$

Stress Field OK?

$$\int_{\mathcal{B}} \underline{\gamma} \cdot [-\underline{\sigma} + \underline{\sigma}^m(\underline{x}, \underline{q}, \underline{\varepsilon})] dv = 0$$

for all variations  $\begin{bmatrix} \underline{\eta} \\ \underline{\gamma} \\ \underline{\tau} \end{bmatrix}$  of the  $\begin{bmatrix} \text{displacement} \\ \text{strain} \\ \text{stress} \end{bmatrix}$  fields  $\begin{bmatrix} \underline{u} \\ \underline{\varepsilon} \\ \underline{\sigma} \end{bmatrix}$

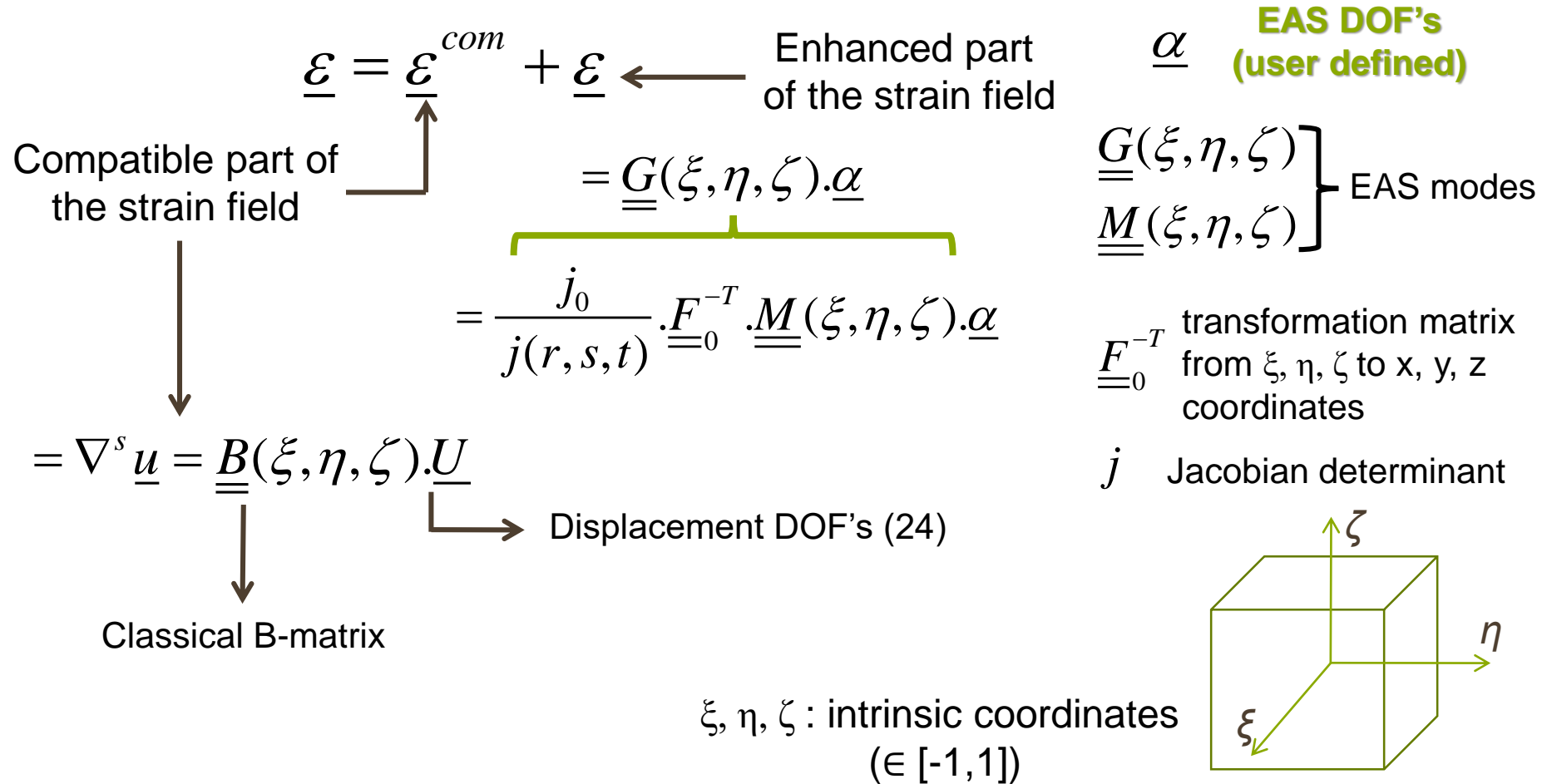
$\nabla^s$  the symmetric gradient

$G_{ext}(\underline{\eta})$  the virtual work of the external loading

$\underline{\sigma}^m(\underline{x}, \underline{q}, \underline{\varepsilon})$  the stress computed by the constitutive law

# FEM A solid shell element... EAS modes

## Or Enhanced Assumed Strain field:



# Possible choices of EAS (Enhanced Assumed Strain modes)

$\underline{M}(\xi, \eta, \zeta) =$

$\xi$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	$\xi\eta$	$\xi\zeta$	0	0	0	0	0	0	0	0	0	0	0	0	0	$\xi\eta\zeta$	0	0	0	0	0	0
0	$\eta$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	$\xi\eta$	$\eta\zeta$	0	0	0	0	0	0	0	0	0	0	0	$\xi\eta\zeta$	0	0	0	0	0	0
0	0	$\zeta$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	$\xi\zeta$	$\eta\zeta$	0	0	0	0	0	0	0	0	$\xi\eta\zeta$	0	0	0	0	0	0	
0	0	0	$\xi$	$\eta$	0	0	0	0	0	0	0	$\xi\zeta$	$\eta\zeta$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
0	0	0	0	0	$\xi$	$\zeta$	0	0	0	0	0	0	0	$\xi\eta$	$\eta\zeta$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
0	0	0	0	0	0	0	$\eta$	$\zeta$	0	0	0	0	0	0	0	$\xi\eta$	$\xi\zeta$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	

→ New EAS DOF's (user defined)  
Solved at the element level

How many to add?  
From 3 to 30 modes

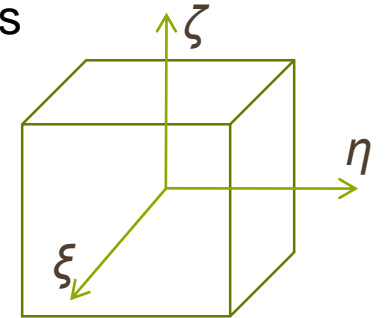
linear shear modes

Improve bending behavior (bilinear Shear modes)

Improve incompressibility behavior (bilinear volumetric modes)

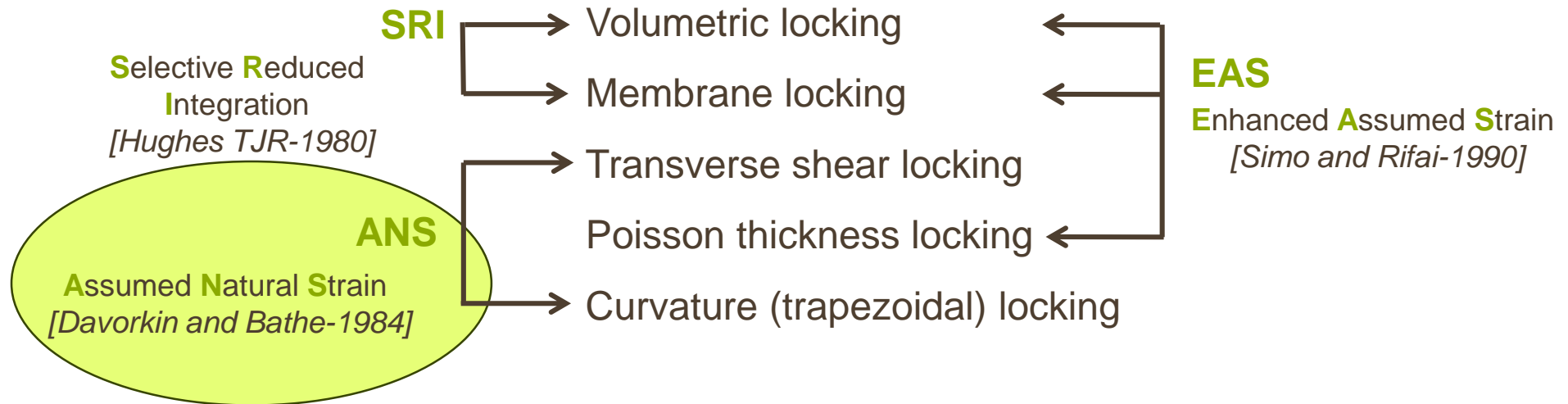
bi linear shear modes

Improve behavior in distorted mesh



# FEM A solid shell element...Features

- Some remedies for locking pathologies

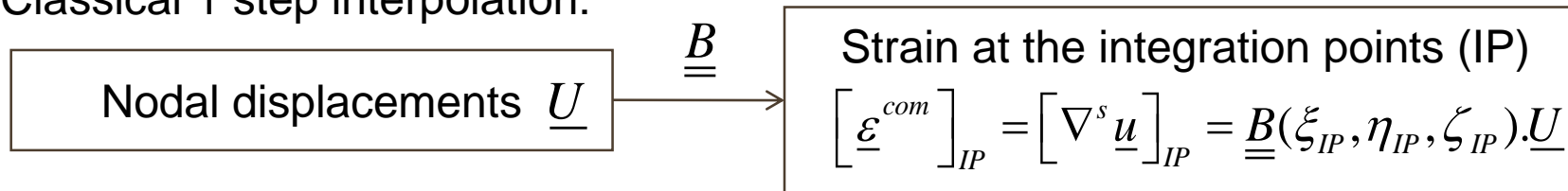




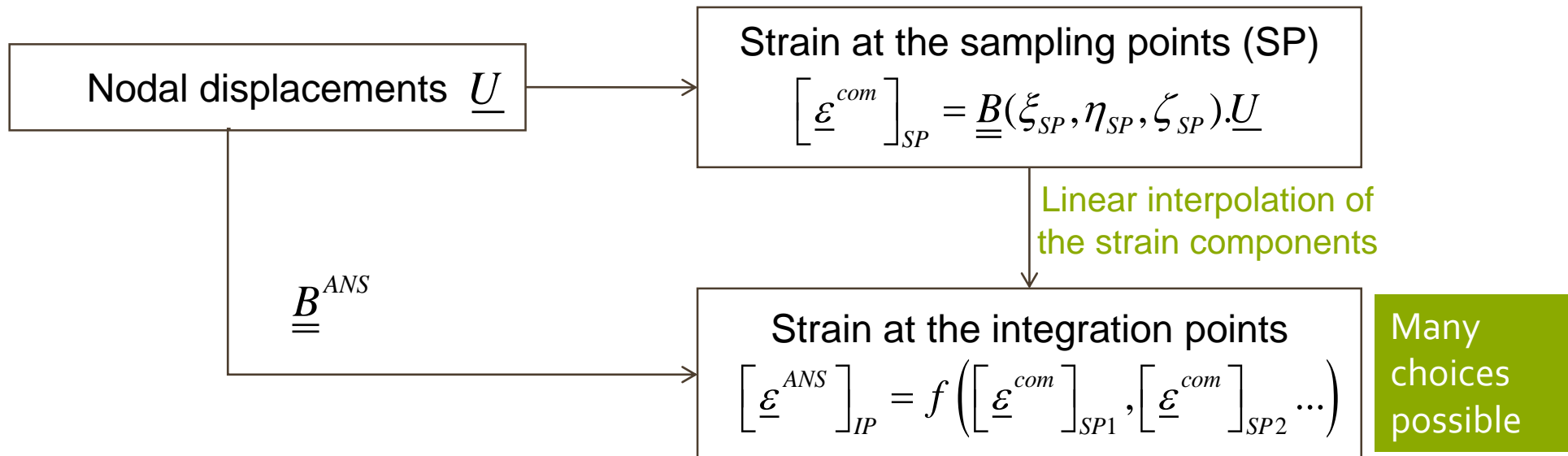
# FEM A solid shell element...ANS (Assumed Natural Strain)

## Principle :

Classical 1 step interpolation:

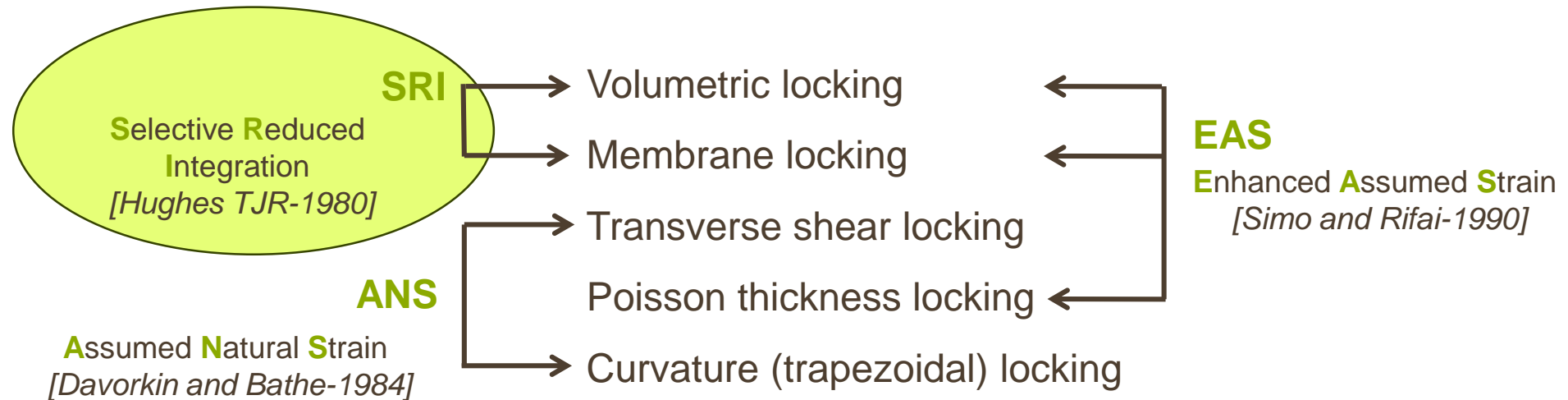


**ANS** 2 step interpolation:



# FEM A solid shell element...Features

- Some remedies for locking pathologies



# FEM A solid shell element...SRI Selective Reduced Integration

Comparative study considering 6 integration points through thickness

	Reduced integration scheme	Full integration scheme
Classical	<p>6 layers =&gt; 28 nodes =&gt; 6 IP <b>84 DOF's</b></p>	<p>3 layers =&gt; 16 nodes =&gt; 24 IP <b>48 DOF's</b></p>
Arbitrary number of IP over the thickness	<p>1 layer =&gt; 8 nodes =&gt; 6 IP <b>24 DOF's</b></p>	<p>1 layer =&gt; 8 nodes =&gt; 24 IP <b>24 DOF's</b></p>

# FEM A solid shell element... Intensive parametric study

- **Conclusion ?** Effect of Material Behavior:

→ Linear elasticity

2 IP over the element thickness OK  
(linear through-thickness stress distribution)

→ Non linear behavior

>5 IP over the element thickness to provide accurate results  
(non-linear through-thickness stress distribution)

- 'Solid tests'
- 'Shell tests'
- 'Beam test'
- 'Sheet Metal Forming and coating'

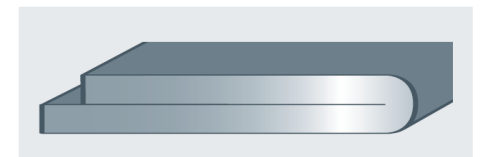
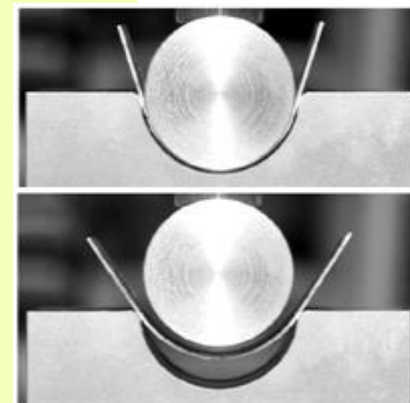
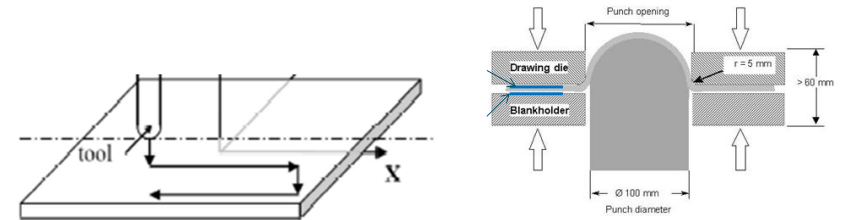
Different choices of EAS and ANS are optimal

5 patch tests

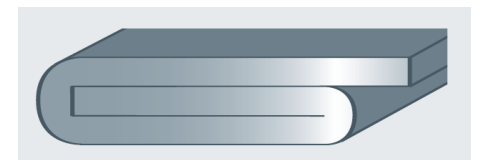
1 incompressibility test

7 Membrane + Bending  
elastic linear tests

4 Non linear tests



0T



1T

# FEM A solid shell References


A reduced integration solid-shell finite element based on the EAS and the ANS concept-Large deformation problems, **M. Schwarze, S. Reese** *Int. J. for Num. Methods in Eng.*, 85 (2011), 289-329

A new one-point quadrature enhanced assumed strain (EAS) solid-shell element with multiple integration points along thickness: Part I - geometrically linear applications, **R. J. Alves de Sousa et al.** *Int. J. for Num. Methods in Eng.*, 62 (2005), 952-977

A new one-point quadrature enhanced assumed strain (EAS) solid-shell element with multiple integration points along thickness - Part II: Nonlinear applications, **R. J. Alves de Sousa et al.** *Int. J. for Num. Methods in Eng.*, 67 (2006), 160-188

W. Van Paepegem, A. M. Habraken, J. Degrieck: A mixed solid-shell element for the analysis of laminated composites, **K. Rah et al.** *Int. J. for Num. Methods in Eng.*, 89 (2012), 805-828

On the comparison of two solid-shell formulations based on in-plane reduced and full integration schemes in linear and non-linear applications, **A. B. Bettaieb et al.** *Finite Elements in Analysis and Design*, 107 (2015), 44-59



Different variants:  
Variational  
Principle, EAS, SRI,  
ANS

Comparison  
between de Souza  
and Bettaieb  
approach



# Contents

✓ A survey of scales and methods

- Finite element method FEM

- ✓ One element: Solid Shell

- Mechanical constitutive laws (multi scale ?)

- Deep Drawing

- Thermo-mechanical analysis

- Cooling of rolling mills

- Continuous casting

- Representative Volume Element (RVE) or in French VER

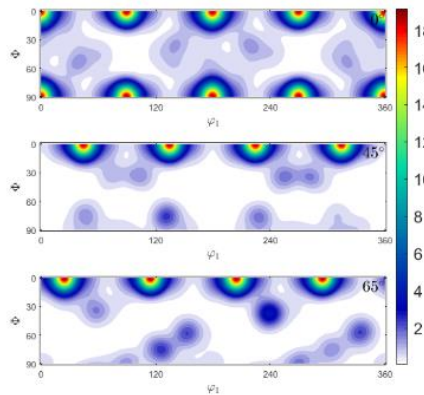
- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning

- Additive Manufacturing

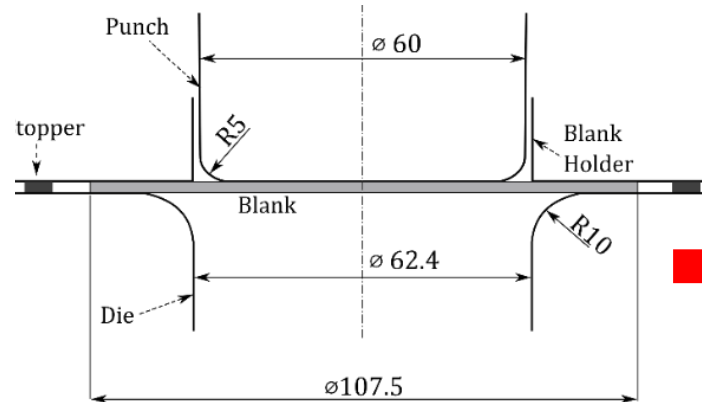
# Experiment and FEM Simu. of AA6016 Cup Drawing Test

Cup drawing of a circular blank ( $\Phi = 107.5\text{mm}$ ) of AA 6016 sheet

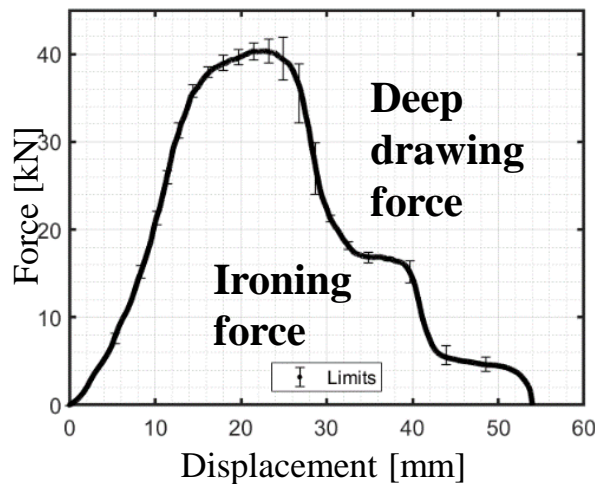
ESAFORM Benchmark 2021



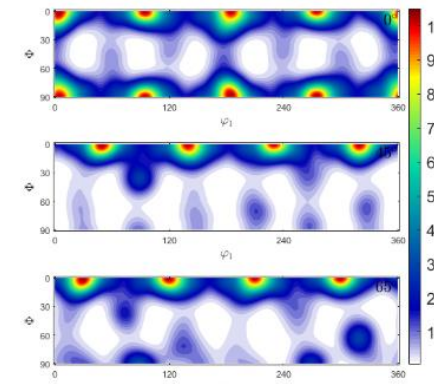
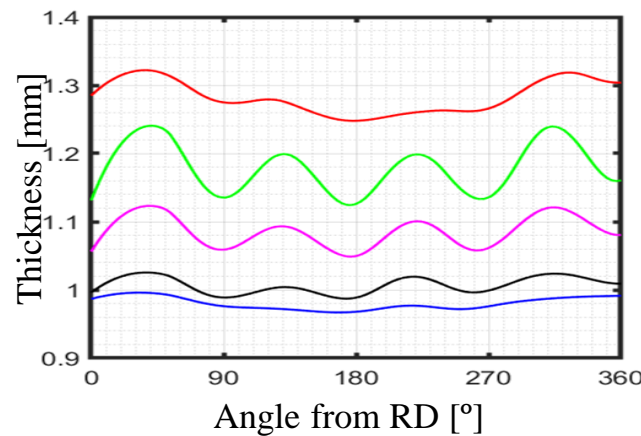
Initial texture



Earing profile

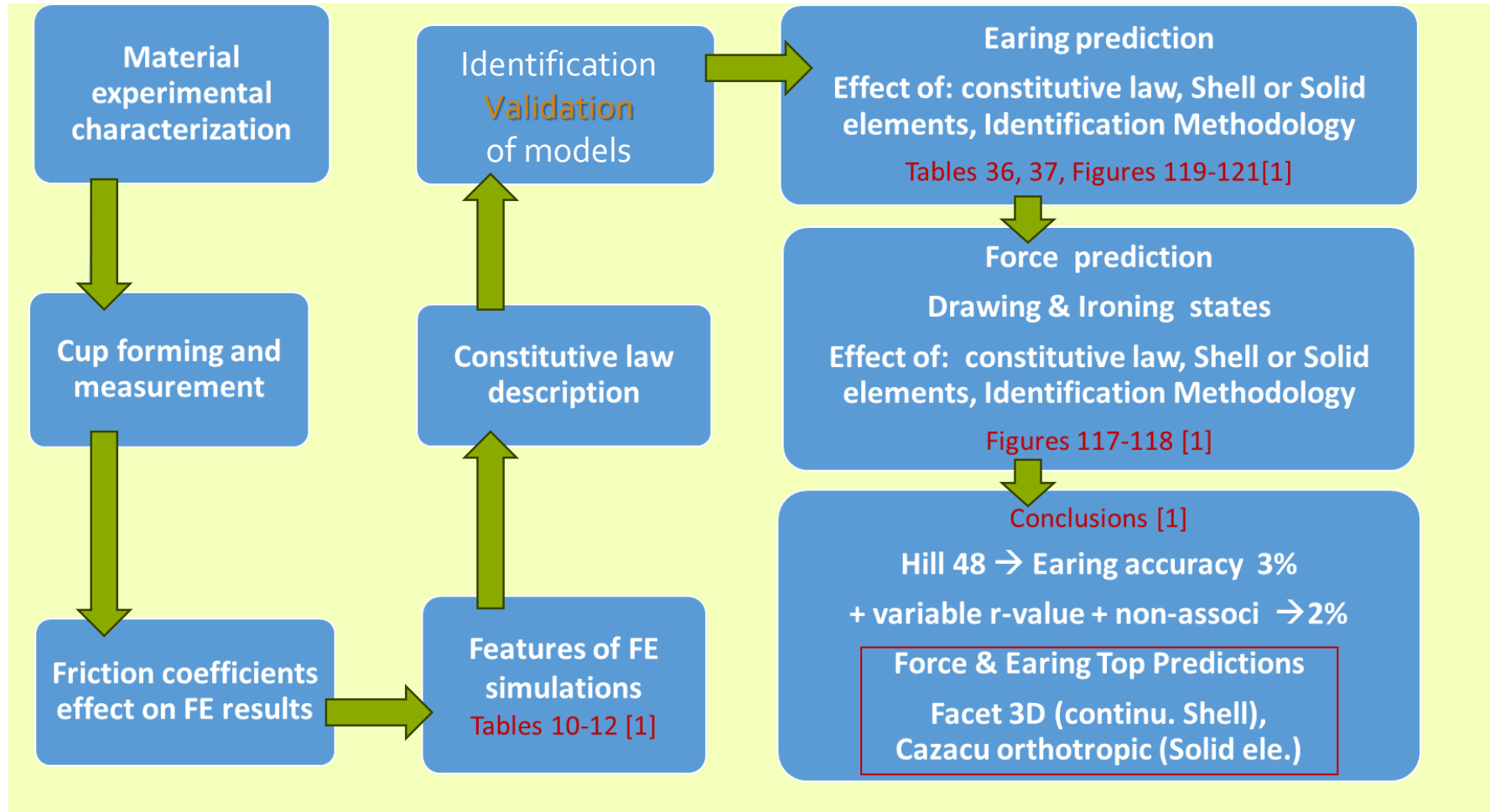


At different heights from cup bottom



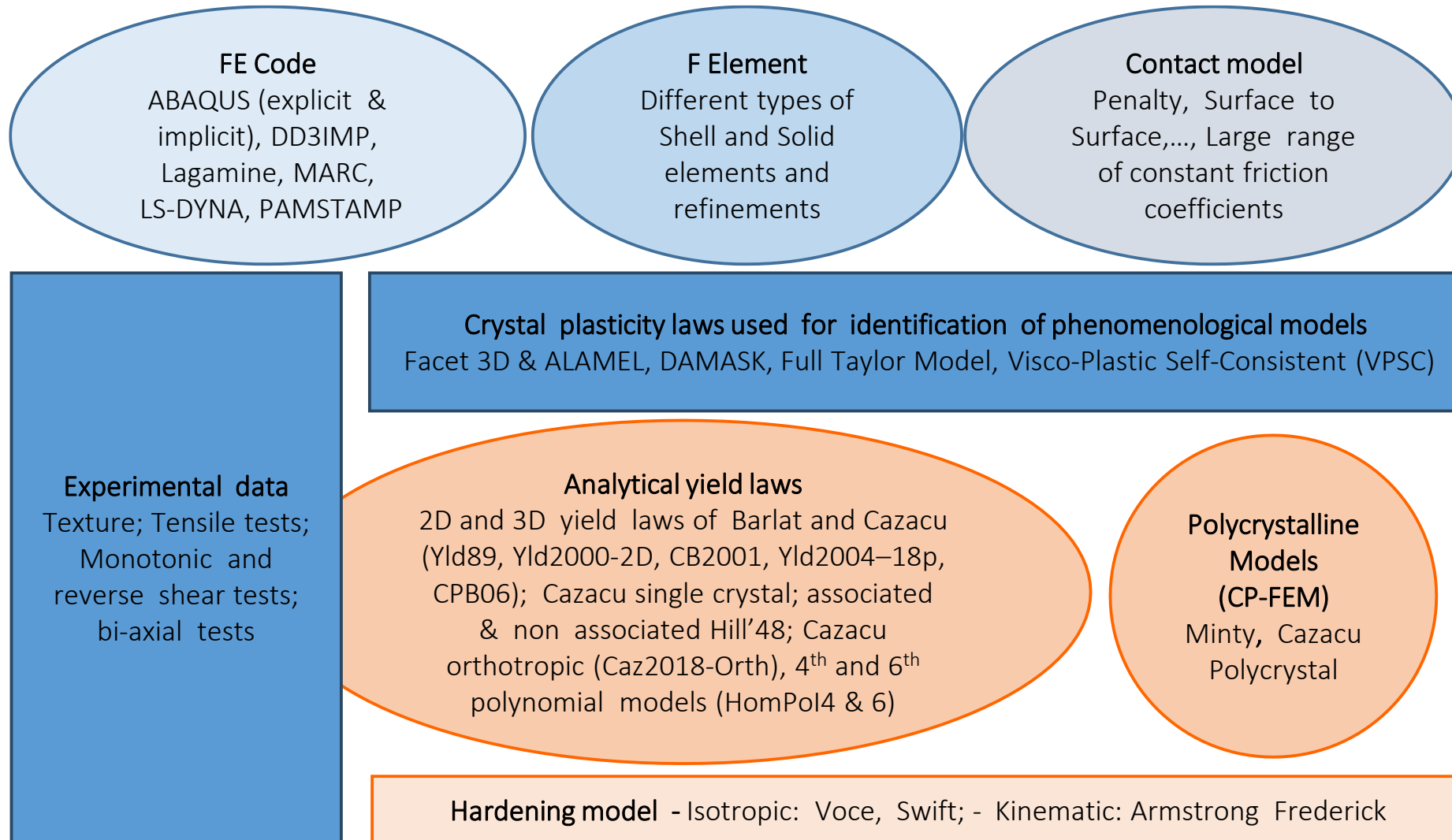
Texture mid wall

# FEM - Content of a collaborative work of 13 teams



Int. J. Material Forming Habraken et al. 2022 (40 authors)

# FEM Codes, elements, contact / constitutive laws/ identification



# FEM Multiscale : different ways to exploit Crystal plasticity

Texture input → Homogenization procedure for Crystal Plasticity models



## Crystal data set:

from 250  
(Caz2018polycryst)  
to 10.000 grains  
(ALAMEL)

+

## Homogenization Approach

Full Taylor assumption

$$\epsilon_{\text{Macro}} = \epsilon_{\text{Micro}}$$

(Minty, Cazacu polycrystal)

$$\epsilon_{\text{Macro}} = \epsilon_{\text{Applied on RVE}}$$

(DAMASK spectral method)

Relaxed Taylor assumption  
& cluster of grains

(ALAMEL)

Self Consistent approach,  
(VPSC)

## Constitutive law

### Data set used for Identification:

#### Texture

+

- 7 exp. r- values and yield stresses for Cazacu polycrystal, and VPSC.
- 1 tensile curve in RD (Minty, ALAMEL, DAMASK)
- Facet 3D identified by virtual tensile tests with ALAMEL

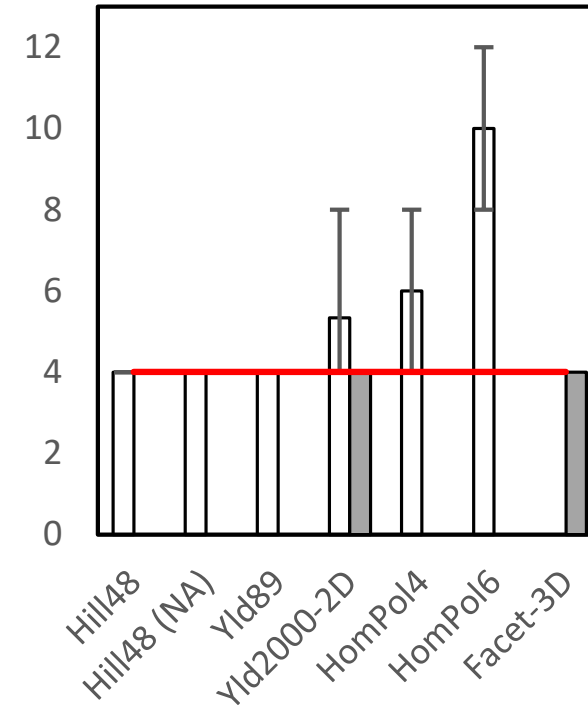
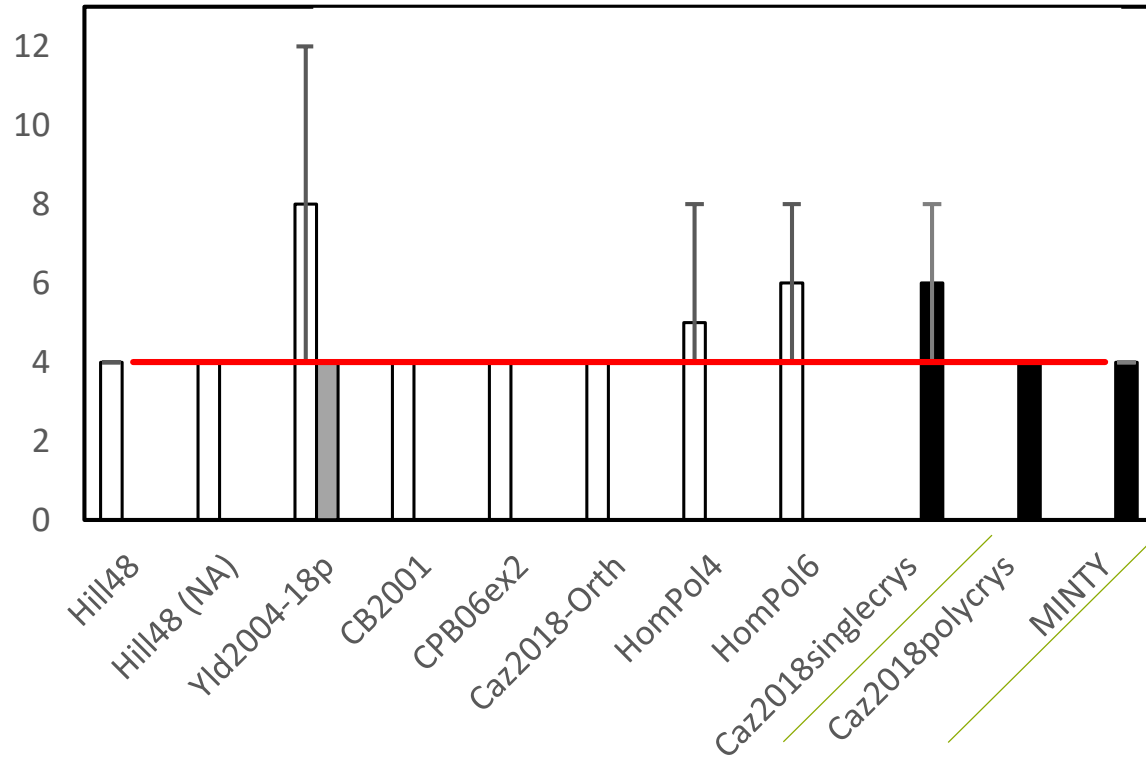


# FEM predictions Number of ears

**Indentification method of the constitutive law**

- Based on physical tests
- Based on physical tests + Virtual ones
- Constitutive law based on crystal plasticity
- Experimental drawing force

Most 3-D orthotropic yield functions → 4 ears, as in experiments



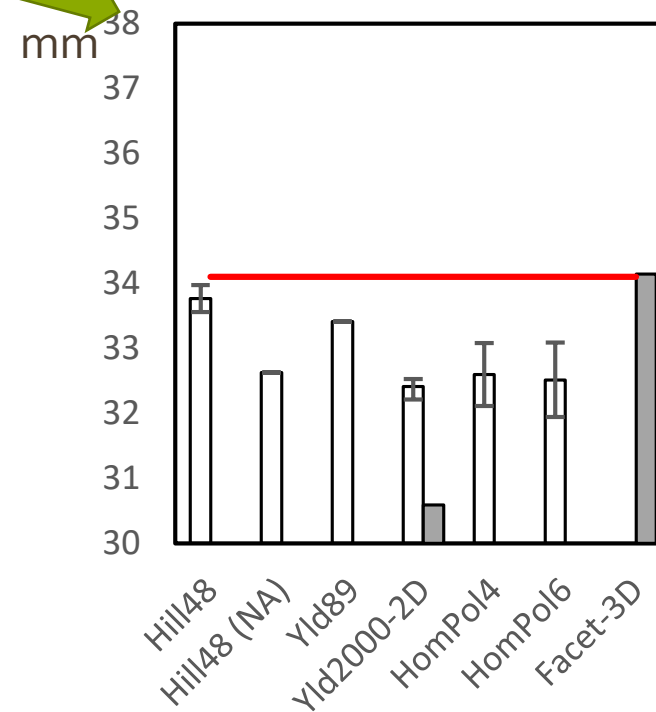
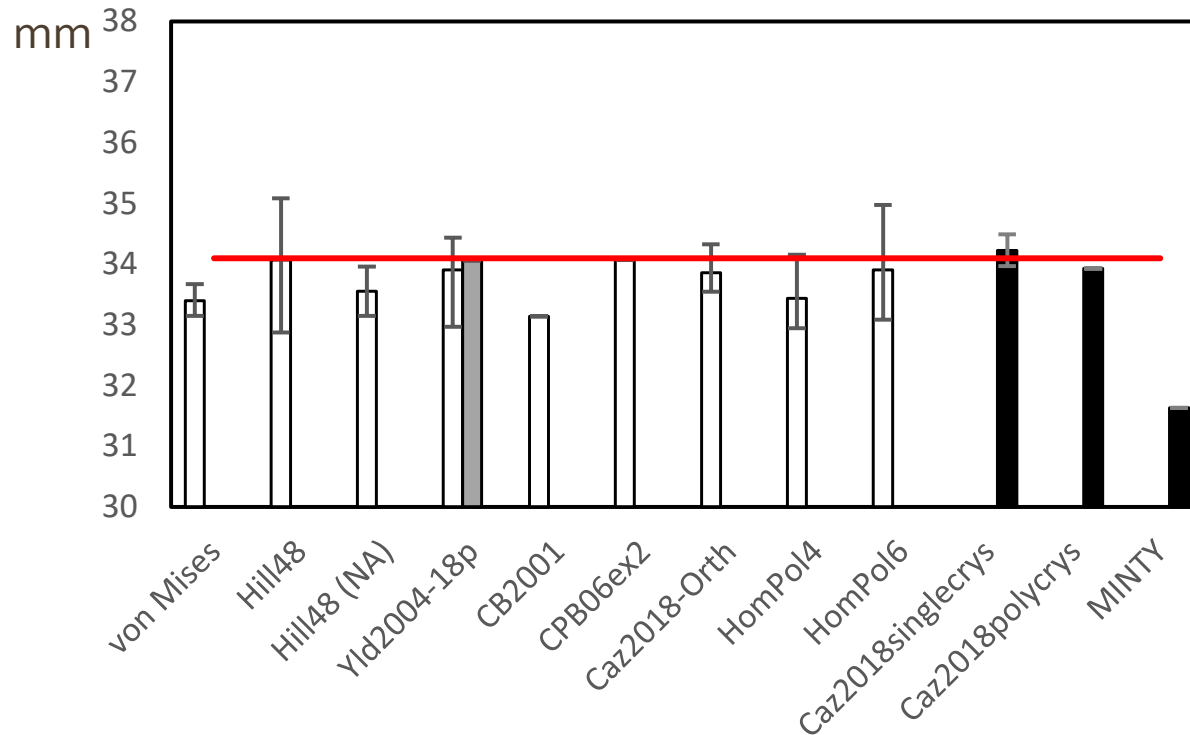
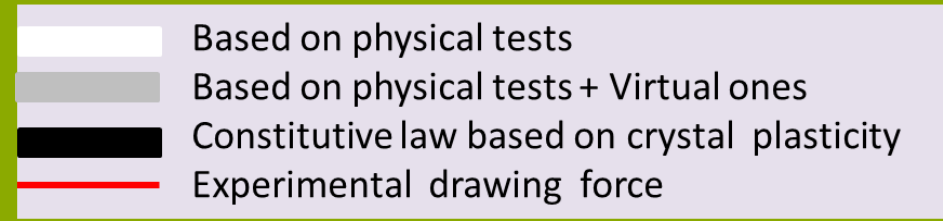
**Solid and Solid -Shell elements + use of yield locus except Caz2018polycrys and Minty (set of representative crystals)**

**Shell elements  
Use of Yield locus**

# Average cup height OK

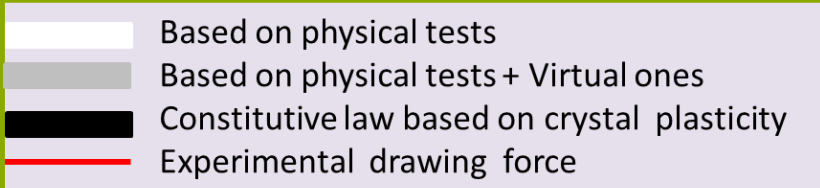
- **von Mises** isotropic yield criterion for reference
- 2D orthotropic yield functions  
Yld89, Yld2000-2D, HomPol4 and HomPol6
- tend to underestimate particularly when combined with shell elements.

## Identification method of the constitutive law



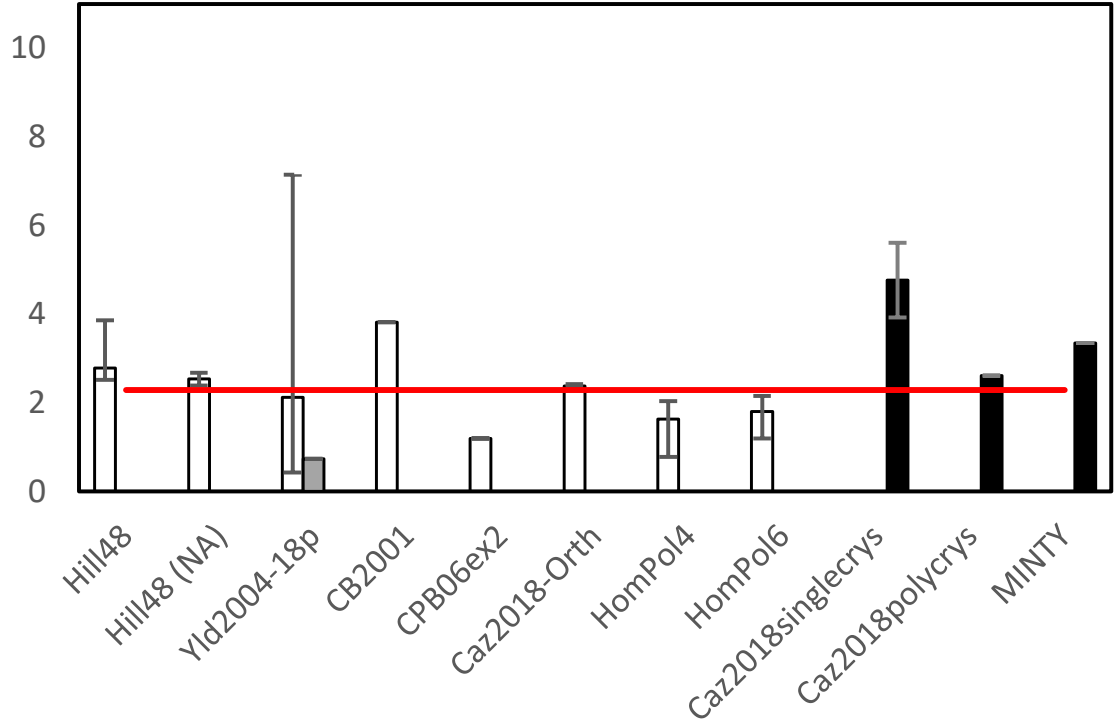
**Solid and Solid -Shell elements + use of yield locus except CaZ2018polycrys and Minty (set of representative crystals)**

**Shell elements Use of Yield locus**

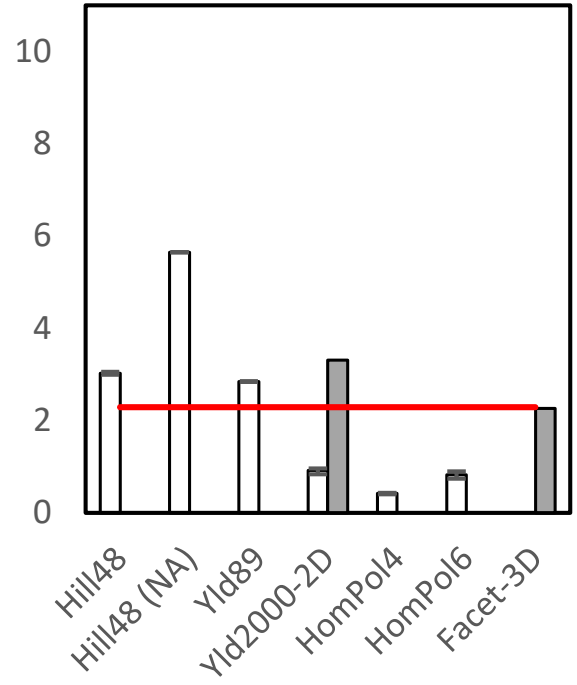


# Average amplitude of the earing profile

Texture variability is important → Single crystal not accurate



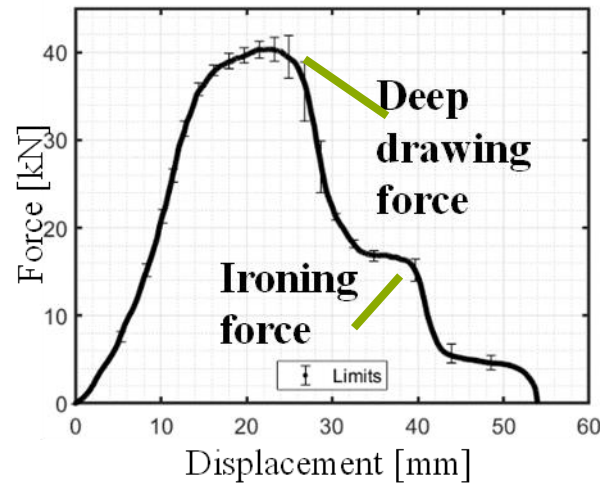
Hill Non Associative seems less accurate for this result.



**Solid-Shell elements (use of yield locus) except Caz2018polycrys**

**Shell elements  
Use of Yield locus**

# Force predictions



**1<sup>st</sup> peak :** quite well predict by all models with the adjustment of the friction coefficient

a reasonable physical range :

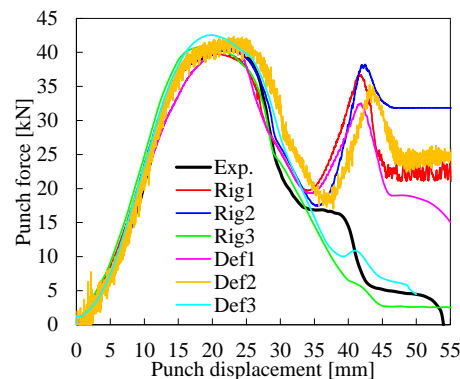
Solid or Solid- shell models  $\rightarrow \mu=0.01$  up-to  $\mu=0.100$

Shell models  $\rightarrow \mu=0.07$  or higher values

**2<sup>nd</sup> Peak :** most FE predictions too high  
worst for shell elements

except - for ABAQUS + S4R element (Ugent)

- for ABAQUS + SC8R element (KUL)



Further analysis with deformable tools:

negligible impact on deep drawing peak

slight impact on 2<sup>nd</sup> peak

but inverse according solid or solid shell elements

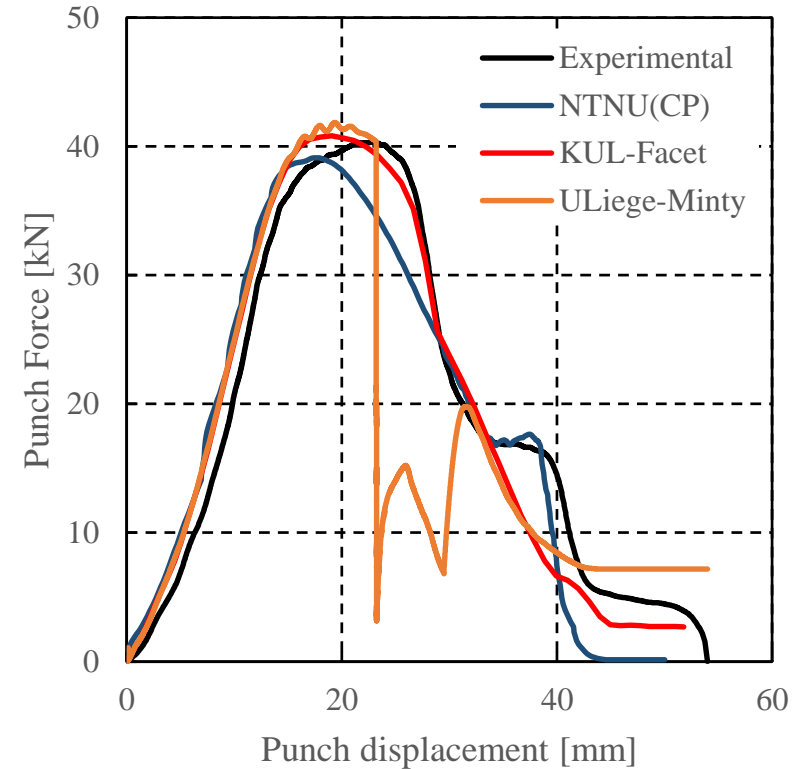
# Force predictions - 3 interesting configurations (ironing peak)

**Yld2004-18p** -ABAQUS implicit – solid element from **NTU**,  
an identification based on 7 virtual tensile tests (Damask -FFT, 7509 grains in  
RVE + physical RD tensile test).

**FACET-3D** – ABAQUS explicit - continuum shell from **KUL**,  
an identification based on 200 virtual tests relying on  
10 000 grains + ALAMEL crystal plasticity model

**MINTY** – Lagamine implicit - solid element from **ULiege**,  
an interpolation yield locus approach based on 1000 crystals  
+ simple Full Taylor plasticity approach;  
(however the start of the ironing stage is not correctly predicted).

crystal plasticity computations to complement physical tests in  
the identification of the yield functions seems to improve the  
prediction of the ironing force.





# Messages from EXACT ESAFORM Benchmark 2021

- Same set of experiments for the material parameter identification,  
Trained scientists using **Hill48 model** ( $\neq$  codes, meshes, element types)  $\rightarrow$  similar predicted earing profiles.  
**Simple Hill48 model** lead to robust predictions of the earing profile.
- For the identification of the parameters: **particular relevance was given** by the participants **to the description of the anisotropy of the Lankford coefficients**, (known strong impact on the earing profile).
- **The identification methodology is a key point to generate reliable results.**

The choice of a representative set of crystals,  
The analysis of Lankford coefficient evolution or not  
Complex yield locus need of a larger training than applying simple analytical formula to identify Hill48 model.  
**This identification work request skilled scientists.**

- **The need of pre-validation checks :**  
is the model able to predict stress anisotropy and Lankford coefficient

# Messages from EXACT ESAFORM Benchmark 2021

- Six types of data.
  - Tensile flow stress anisotropy,
  - r-value anisotropy,
  - yield locus (biaxial tests),
  - earing profile,
  - force evolution in cup forming
  - monotonic and reverse shear tests are available.



**none of the models  
could accurately  
describe the complete  
picture.**

- Yield stress anisotropy under uniaxial loadings not well predicted, particularly the one at  $45^\circ$ , by most of the models (including the ones based on crystal plasticity).

Not critical for the correct prediction of the earing profile relevant for other processes

- **Barlat model 2004-18parameters: yield locus quite sensitive**
  - it can be quite accurate
  - however implementation by different teams
  - for the same set of parameters generate different results

# Macro and Multiscale FEM references in sheet forming

Benchmark ESAFORM 2021 Raw data

<https://zenodo.org/records/6874577>

Description ↘

Analysis of ESAFORM 2021 cup drawing benchmark of an Al alloy, critical factors for accuracy and efficiency of FE simulations

A.M. Habraken, T.A. Aksen, J.L. Alves, R.L. Amaral, E. Betaieb, N. Chandola, L. Corallo, D.J. Cruz, L. Duchêne, B. Engel, E. Esener, M. Firat, P. Frohn-Sørensen, J. Galán-López, H. Ghiabakloo, L.A.I. Kestens, J. Lian, R. Lingam, W. Liu, J. Ma, L.F. Menezes, T. Nguyen-Minh, S.S. Miranda, D.M. Neto, A.F.G. Pereira, P.A. Prates, J. Reuter, B. Revil-Baudard, C. Rojas-Ulloa, B. Sener, F. Shen, A. Van Bael, P. Verleysen, F. Barlat, O. Cazacu, T. Kuwabara, A. Lopes, M.C. Oliveira, A.D. Santos, G. Vincze,

*Int J Mater Form* **15**, 61 (2022).

<https://doi.org/10.1007/s12289-022-01672-w>

**ESAFORM grant of 15000€ enhances true collaboration.** It aims to study any related problem to material forming. Deliverables :

- oral presentation of the conf.
- an IJMF paper

Spirit of understanding, transparency of methods experiments to reach results. No competition

Application each 3<sup>rd</sup> Sept

(4 pages, 3 institutions, within organizing committee  
3 ESAFORM members)

Cazacu O, Revil-Baudard B, Chandola N (2019) Plasticity damage couplings: from single crystal to polycrystalline materials. *Springer, Berlin Heidelberg*

Yield locus functions + Polycrystal Multiscale Crystal Plasticity (CP) (small set of grains but high accuracy) → OK for forming process

Van Houtte P, Gawad J, Eyckens P, Van Bael B, Samaey G, Roose D (2011)

A full-field strategy to take texture-induced anisotropy into account during FE simulations of metal forming processes. *JOM* 63(11):37–43.

<https://doi.org/10.1007/s11837-011-0189-9>

Update yield locus shape due to CP relying on 1000 grains in FE simu but efficient CPU computation

Galan J, Verleysen P, Lebensohn RA (2014)

An improved algorithm for the polycrystal viscoplastic self-consistent model and its integration with implicit finite element schemes. *Model Simul Mater Sci Eng* 22(5):055023.

Efficient VPSC code ready to collaborate, share

# Contents

✓ A survey of scales and methods

- Finite element method FEM

- ✓ One element: Solid Shell

- ✓ Mechanical constitutive laws (multi scale ?)

- ✓ Deep Drawing

- Thermo-mechanical analysis

- Cooling of rolling mills

- Continuous casting

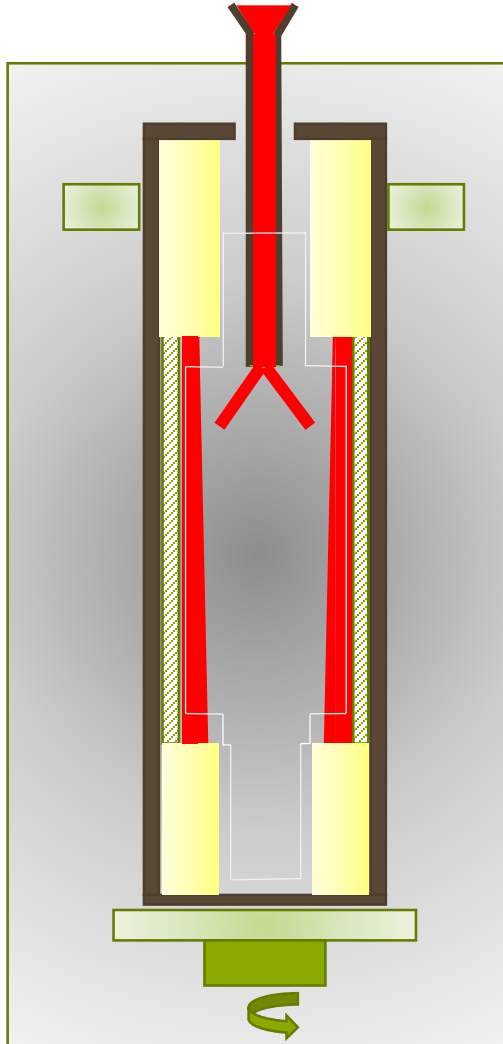
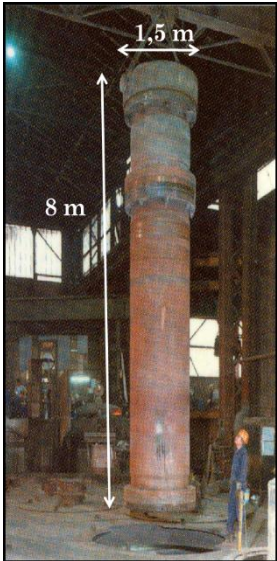
- Representative Volume Element (RVE) or in French VER

- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning

- Additive Manufacturing

# FEM Thermo-Mechanical –Metallurgic Simulations

## Vertical spin casting process



Transformations during cooling

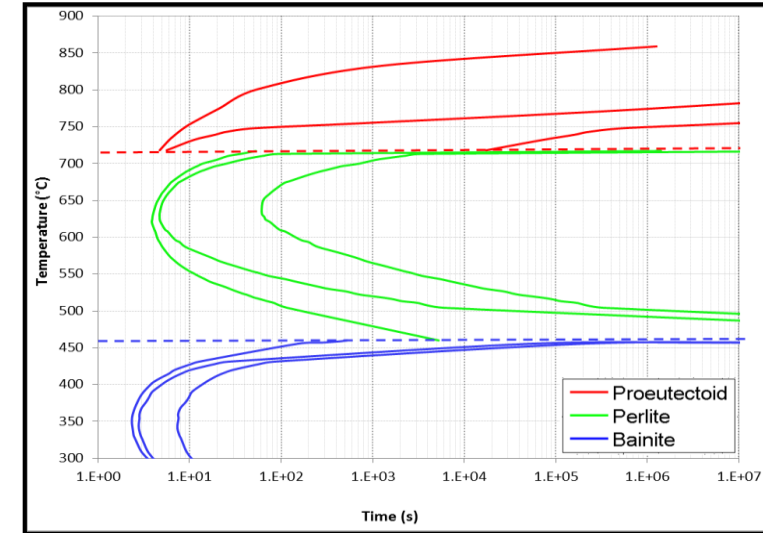
- by diffusion (ferrite, pearlite, bainite)

- TTT diagram
- Additivity rule
- Sheil's sum (nucleation)
- JMAK law

(Johnson-Mehl-Avrami-Kolmogorov)

- Displacive Martensitic transformation

Koistinen Marburger's law



$$y_i = y_{i,\gamma} (1 - \exp(-A_M (M_S - T)))$$

High wear resistance in shell: High Chromium Steel Alloy  
High toughness in core : Spherical Graphite Iron



**Challenge:**  
 high amount of data  
 +  
 Average values  
 (heterogeneous material) :  
 High Chromium Steel Alloy  
 12 to 15% carbides  
 strong variation in C contents  
 in the matrix  
 → scattering in Ms tp°, etc

**Inverse model  
 = key  
 methodology**

INPUT DATA

Thermo physical  
 parameters  
 $\alpha, \rho, \lambda, C_p$  for each  
 phase f(T)

Metallurgical parameters  
 TTT diagrams  
 Transformation strain  
 Plasticity transf strain,  
 Shift of transformation  
 Coef of Koist Marburger  
 Latent heat of transfo

Mechanical parameters  
 $(E, \nu, E_t, \sigma_y$  for each phase f(T))

**FEM  
 Thermo  
 Mechanical  
 Metallurgical  
 Coupled  
 simulations**

OUTPUT DATA

Stresses  
 $(\sigma_x, \sigma_y, \sigma_z, \sigma_{xy})$

Strains  
 $(\epsilon_{thr}, \epsilon_{pr}, \epsilon_{phr}, \epsilon_{ptr})$

Phase rates  
 $(\%Fe, \%Pe, \%Ma)$

Analysis of results

TTT diagrams recovered  
 from literature CCT

Heat transfer during  
 cooling recovered from  
 surface tp° measurement

Thermo Physical  
 properties + latent heat :  
 measured

Phase transformation strain recovered  
 from dilatometric tests

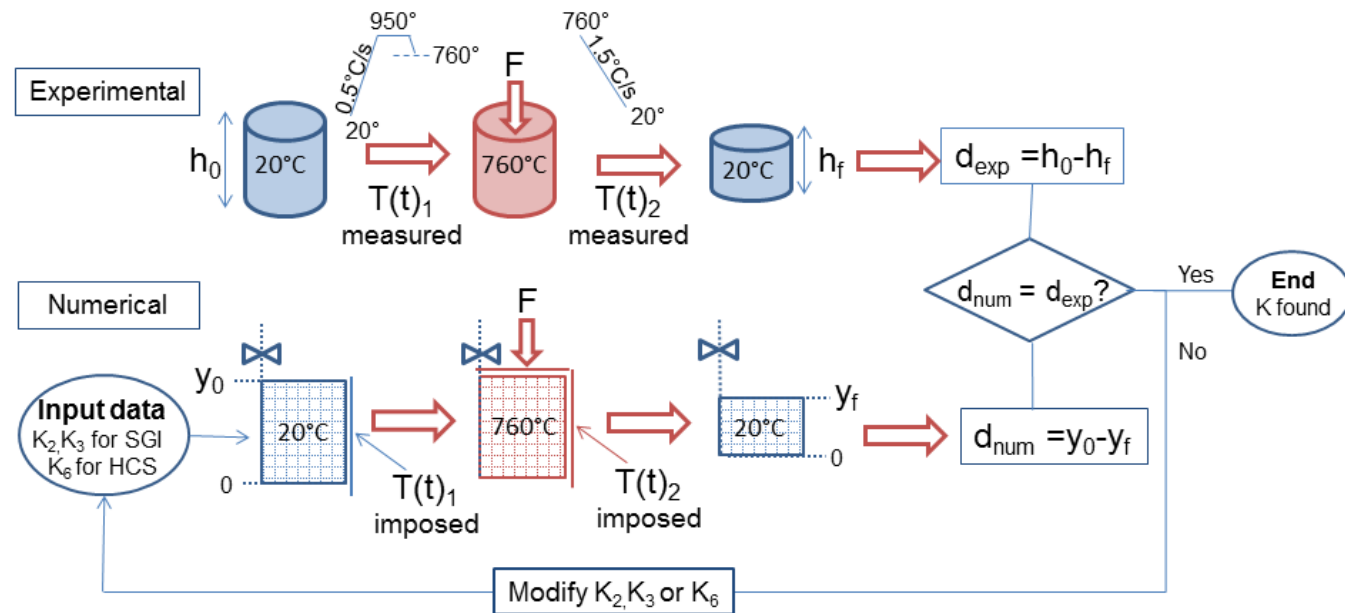
Compression tests on  
 samples with known % Fe Ba Ms

Tests at different tp° but 1 strain rate →EP  
 model and not EVP

# Induced Plasticity Transformation = a strain additional to the phase transformation strain that appears if a stress is present during transformation

Experiment

Compress the sample during cooling and phase transformation

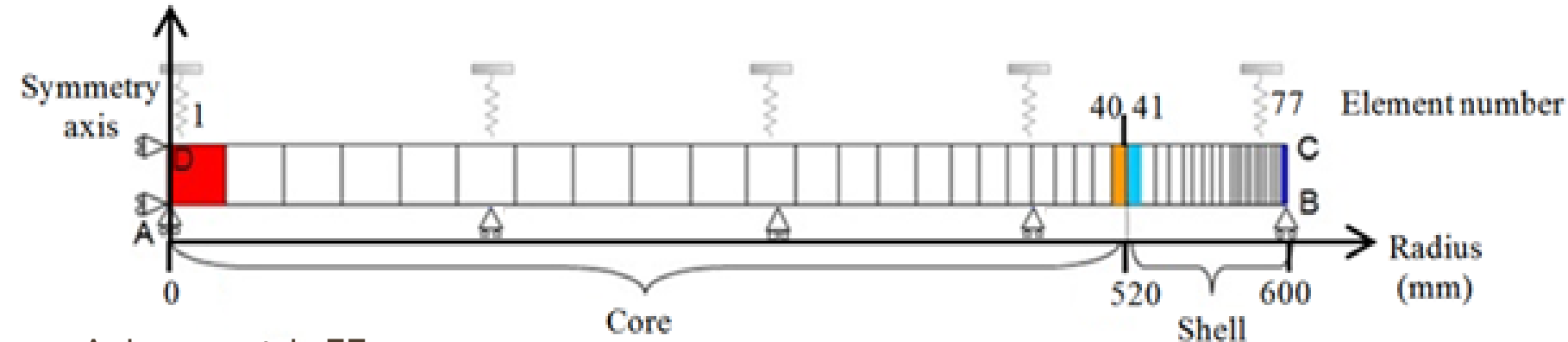


Values not easy to measure (large scattering)

$\bar{\epsilon}_{pt} = K_2(\bar{\sigma} - \sigma_s)y_{Fe}$	$11 \times 10^{-10} \text{ Pa}$	$k_2$	ferrite
$\bar{\epsilon}_{pt} = K_3(\bar{\sigma} - \sigma_s)y_{Pe}$	$11 \times 10^{-10} \text{ Pa}$	$k_3$	pearlite
$\bar{\epsilon}_{pt} = K_6\bar{\sigma}(2 - y_M)y_M$	$0.60 \times 10^{-10} \text{ Pa}$	$k_6$	martensite

Within range of literature values

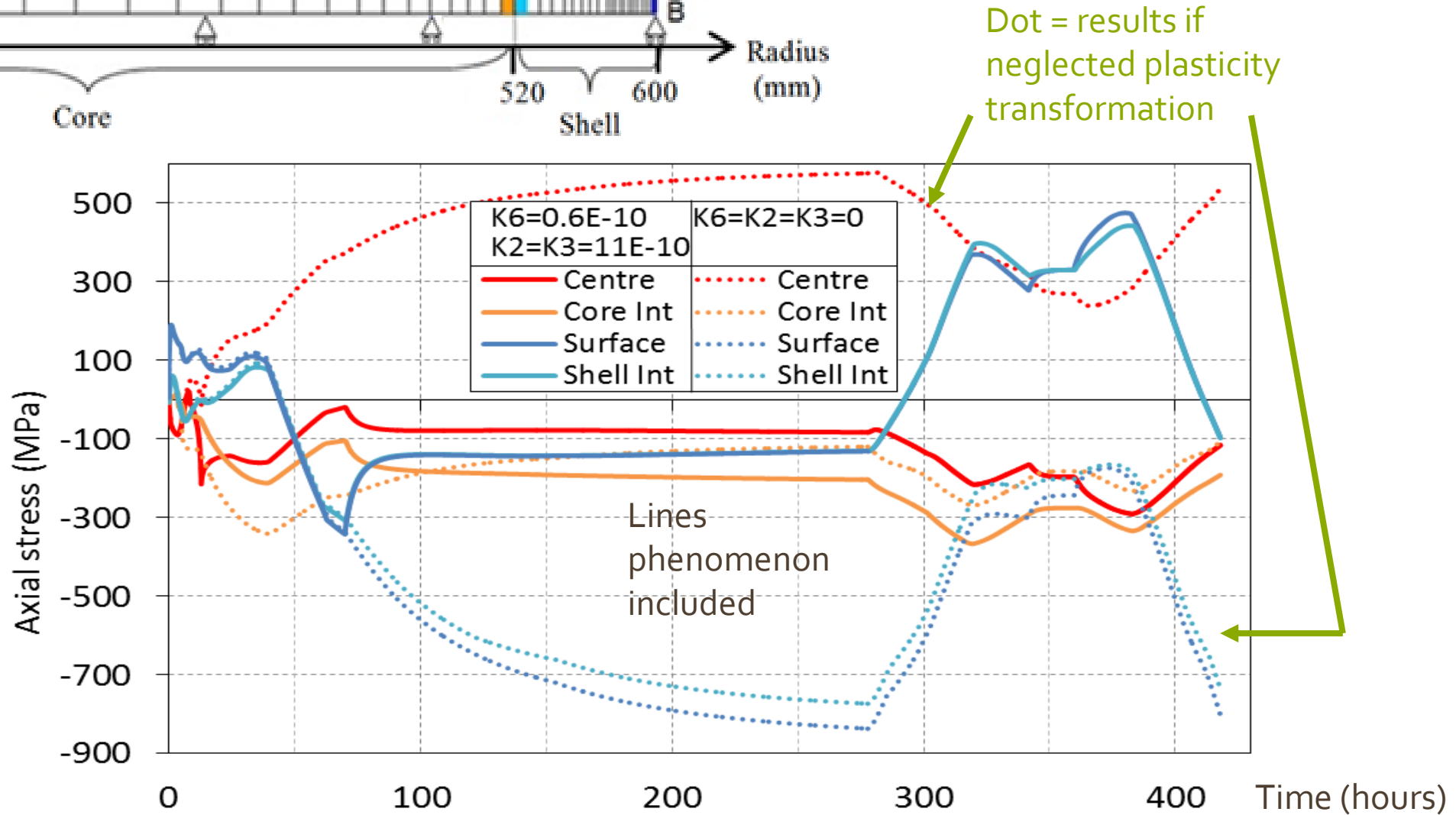
# FE stress vs time



Axisymmetric FE simulation

Stress history in different locations

Strong sensitivity to plasticity transformation parameters (Accuracy ??)



$K_2$  = ferrite transformation  $K_3$  = ferrite transformation  $K_6$  = martensite transformation

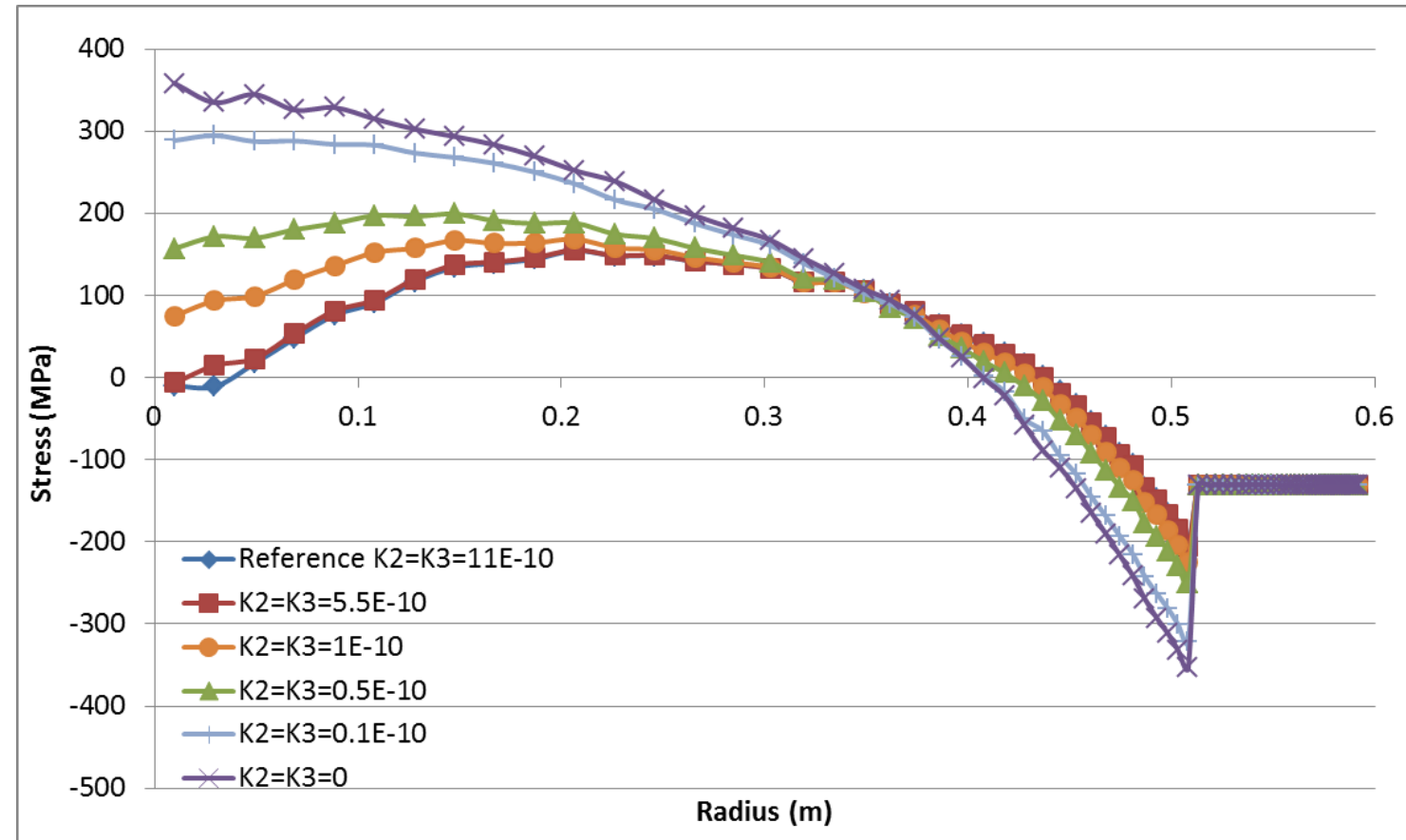
# Effect of "Induced Plasticity Transformation" coefficients

FE stress vs radius

Spherical Graphite Iron:  
Ferrite and Pearlite  
transformations under  
stress generate "induced  
plastic strain"

→ Modify shape of  
core residual  
stresses

not of shell  
stress



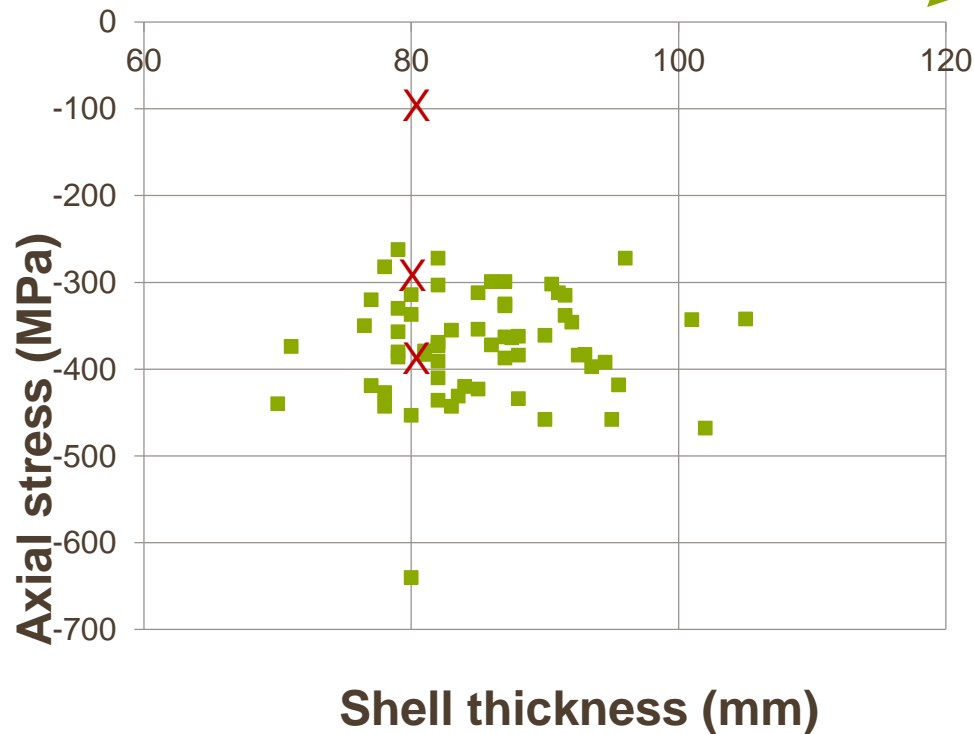
Constant  $k_6$  value

# Residual axial stress measurements // simulations

FEM – Phase transformation Ther Meca Meta

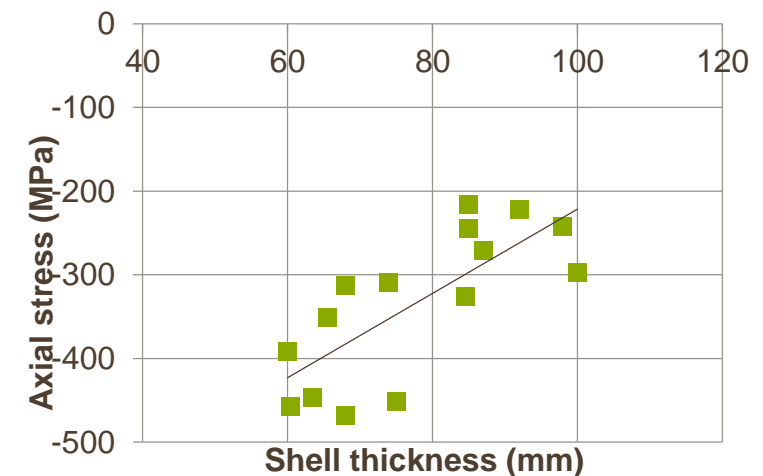
X FE = predictions  
with different K6

Reference case roll of 1.2 m diameter



Diameter roll of 1.2 m:  
no clear effect of shell thickness

For smaller diameter rolls  
(0.95 to 1 m):  
stress ↑  
if shell thickness ↑



# Thermo Mechanical Metallurgical FE simulations - References

Phase Transformations and Crack Initiation in a High-Chromium Cast Steel Under Hot Compression Tests. **Tchuindjang J. et al.** (2015). *Journal of Materials Engineering and Performance*, 24  
<https://doi.org/10.1007/s11665-015-1464-7>

Experiments, Simulation for Rolling Mill case

FE modeling of the cooling and tempering steps of bimetallic rolling mill rolls. **Neira Torres et al.** (June 2017). *International Journal of Material Forming*, Volume 10, (Issue 3), 2017  
<https://doi.org/10.1007/s12289-015-1277-0>

A New Concept for Modeling Phase Transformations in Ti6Al4V Alloy Manufactured by Directed Energy Deposition. **Tchuindjang J. et al.** (2021) *Materials*, 14 (11).

About JMAK, KM models for LPBF and TA6V alloy

Modelling of austenite transformation along arbitrary cooling paths **Pohjonen A. et al.** , 2018, *Computational Materials Science*, Volume 150,  
<https://doi.org/10.1016/j.commatsci.2018.03.052>

Variant of JMAK model

Coupling kinetic Monte Carlo and finite element methods to model the strain path sensitivity of the isothermal stress-assisted martensite nucleation in TRIP-assisted steels **Cluff et al.** (2021) *Mechanics of materials*, (154)  
<https://doi.org/10.1016/j.mechmat.2020.103707>

The model TRIP behavior needs a phase transfo model :  
thermodynamic and crystallography approach implemented through  
Monte Carlo kinetic computation and RVE FEM



# Contents

✓ A survey of scales and methods

- Finite element method FEM

  - ✓ One element: Solid Shell

  - ✓ Mechanical constitutive laws (multi scale ?)

    - ✓ Deep Drawing

  - Thermo-mechanical analysis

    - ✓ Cooling of rolling mills

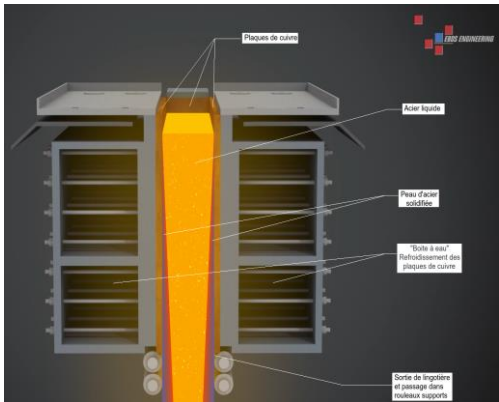
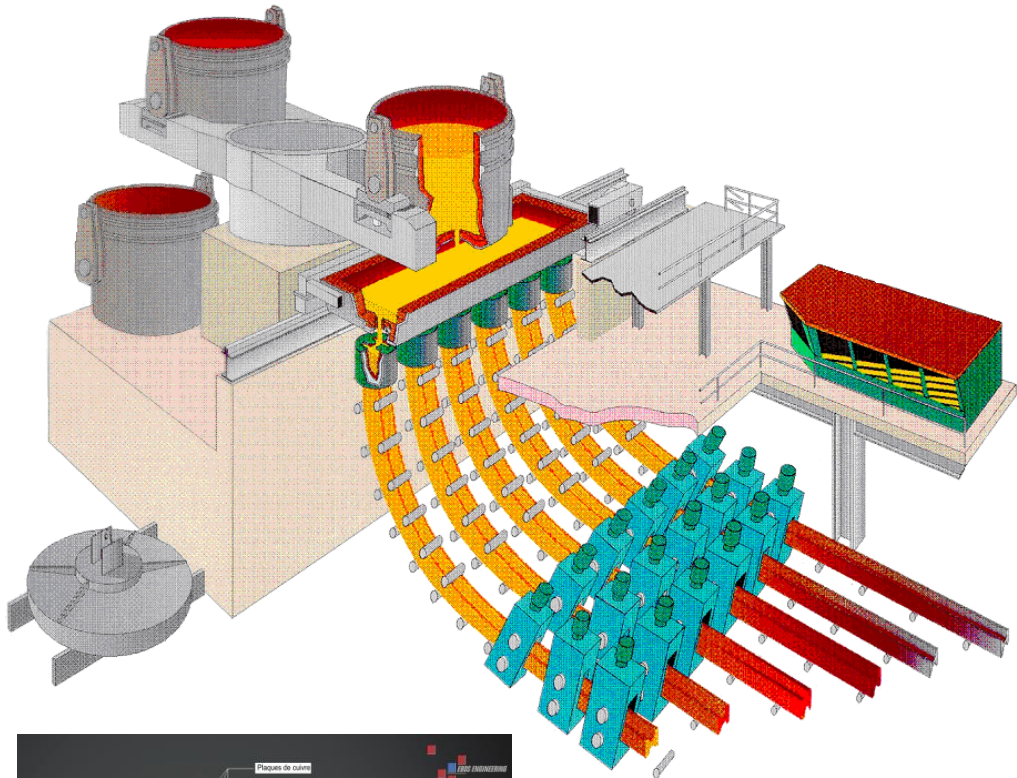
    - Continuous casting

- Representative Volume Element (RVE) or in French VER

- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning

  - Additive Manufacturing

# Continuous casting

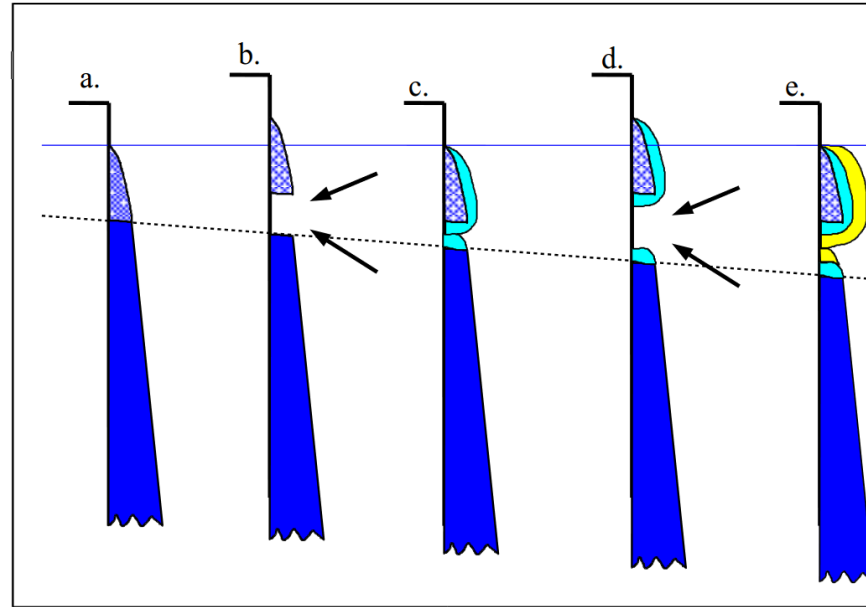


Thermal signature of a crack propagating within the mold

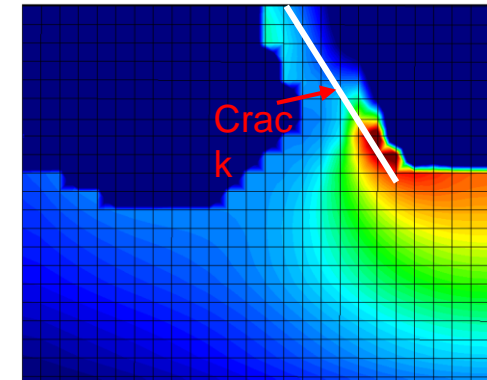
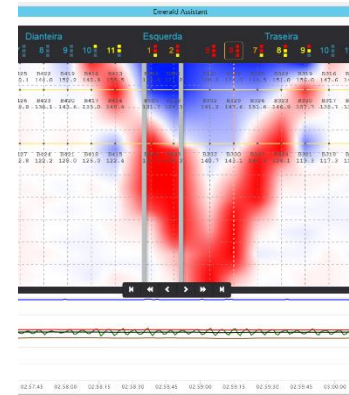
Solid FEM analysis well chained...

## What is the issue ?

## Breakthrough prevention



EBDS Engineering observation // FE prediction

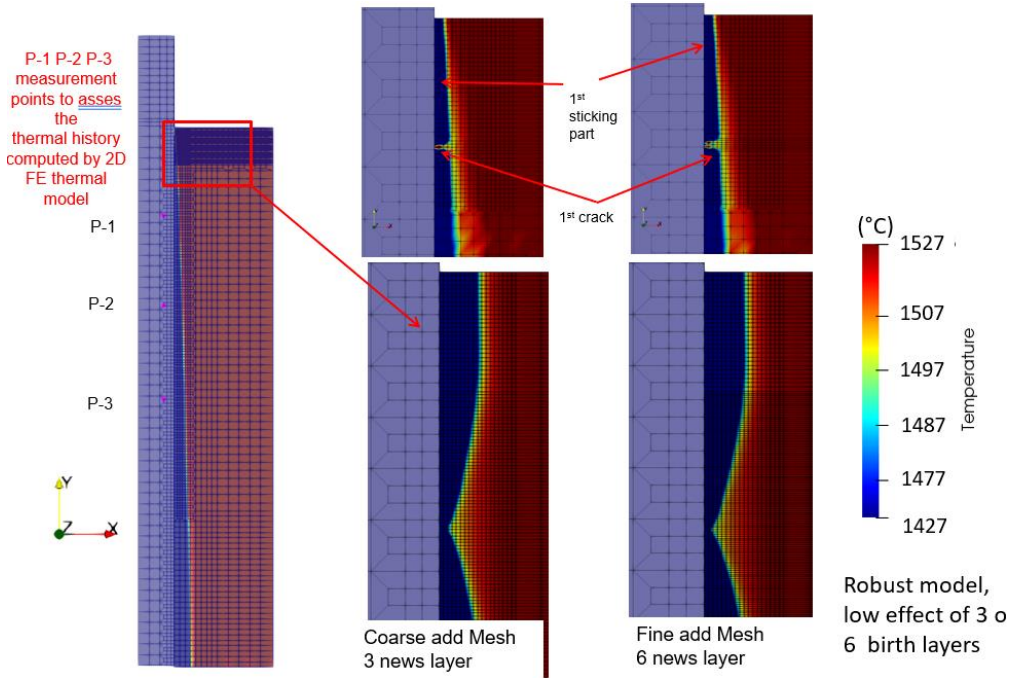


Principal Strain

# Continuous casting

## Methodology ?

## Breakthrough Model



2D FE global thermal analysis - coarse mesh → thermal macro field

specific feature : “switch” on of new element for new fluid  
On going simulation to reach stationary state (no eulerian approach, lagrangian one)

2D FE local thermal analysis – refined mesh

-projection of stationary  $T_p^0$  field as initial state

-introduction of a crack:

- A mesh part sticked to the mold “upper mesh”
- A “lower mesh” part go down
- *Between:* a few layers of FE at liquid  $t_p^0$  fill the gap “crack layers”

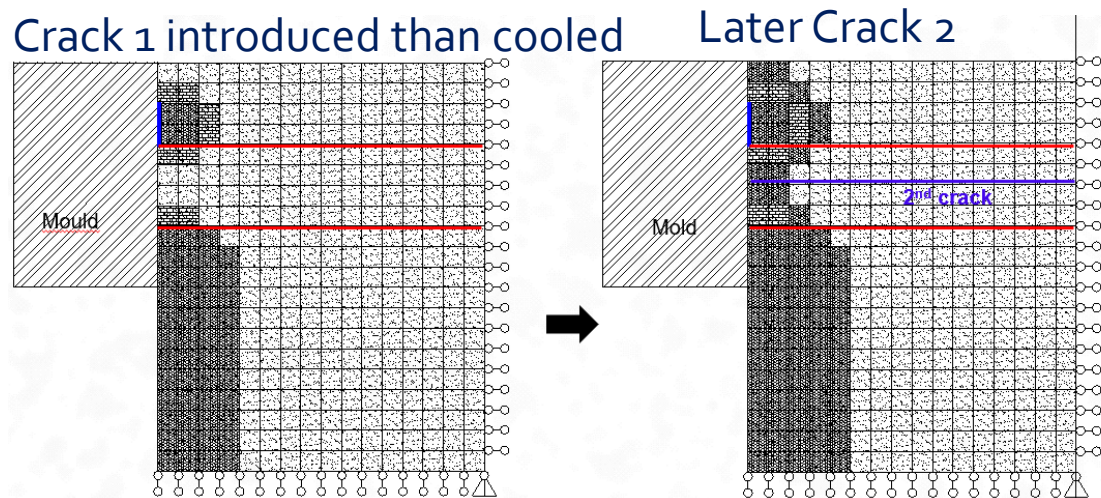
→ Crack 1

- Time of cooling Crack 1 is solidified (strand compression)
- Oscillation goes on (strand tensile) a new crack appears

→ Thermal field follows the crack propagation as new cracks are inserted based on *relative mould-strand velocity*

**Model validated by the trends known in industry**

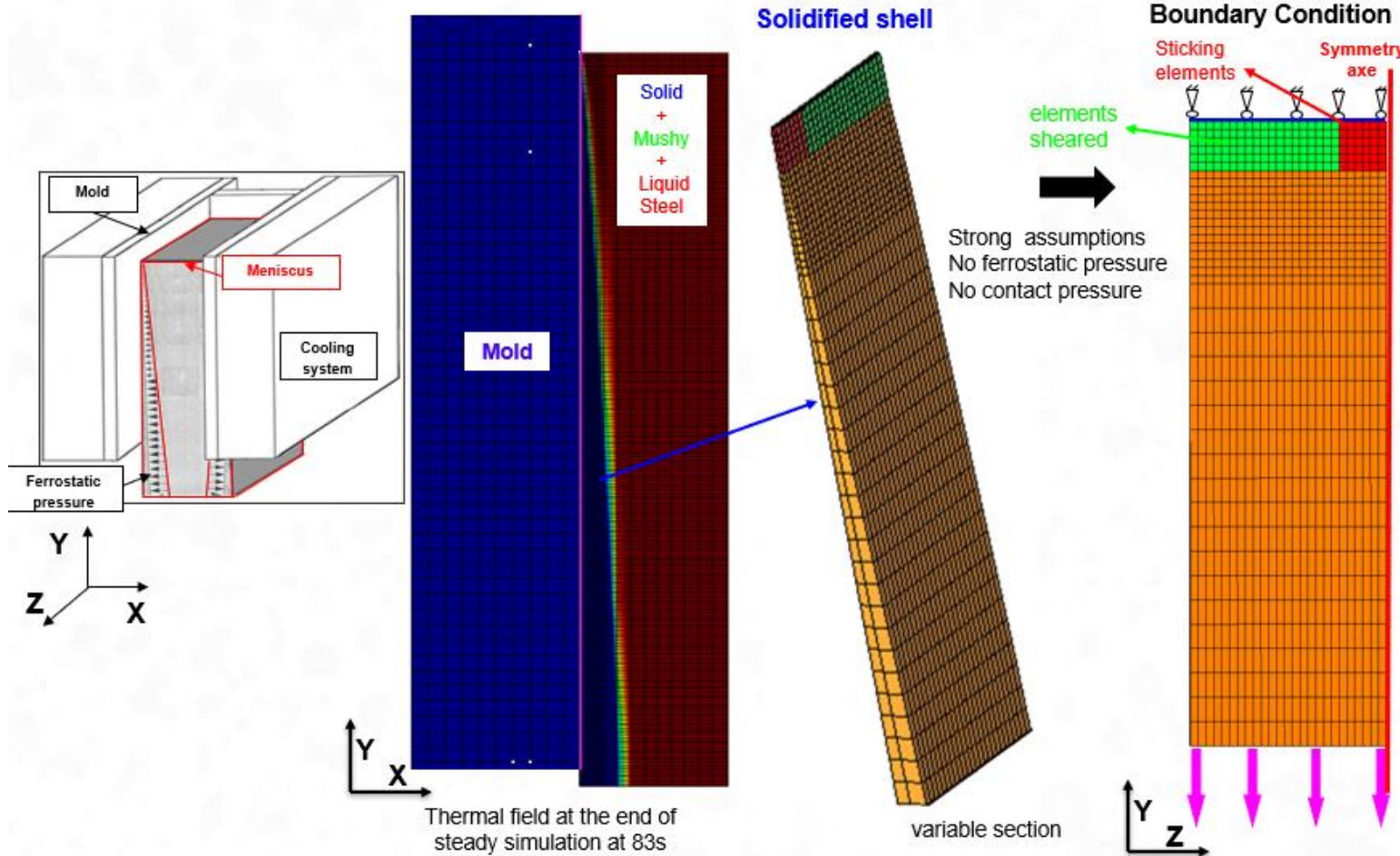
Tran H. S. et al. Procedia Manufacturing 50 2020





# Continuous casting

## Methodology ?



## Breakthrough Model



3D FE thermo mechanical analysis based on the 2D thermal defining boundary conditions

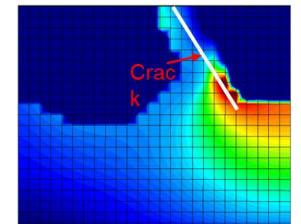
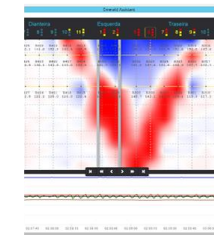
Constitutive model of mushy zone based on Schwartz PhD (Uliece 2011)

Crack criterion ??  
Just Principal strain "rate"

→ effect of casting speed  
→ steel grade

Crack angle and speed // Experiments  
**Model for trends**

EBDS Engineering observation // FE prediction



Principal Strain

Tran H. S. et al. Procedia Manufacturing (ESAFORM and Metal Forming 2020)

# Continuous casting

What is the issue ?

Transversal Cracks in Unbending zone

Methodology ?

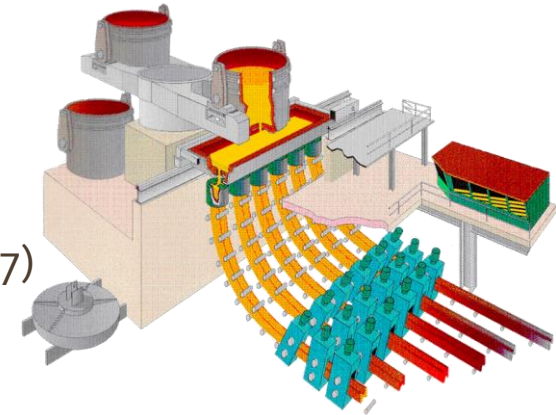
1<sup>st</sup> Get Stress and  $T_p^\circ$  histories

2.5 D FEM Correct Mechanical Field (Stress history)

Generalized plane strain FE with interaction with bulging measurement

*Pascon et al Computer Methods in Applied Mechanics & Engineering (2007)*

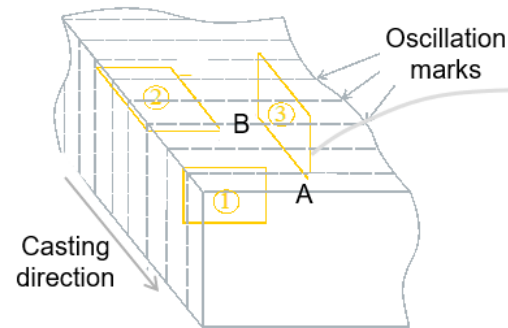
3D FEM Coupled or staggered codes but often difficult to get the whole history



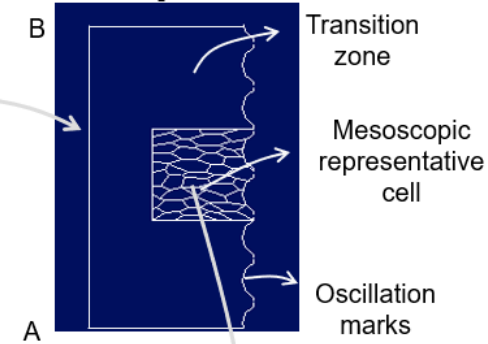
2<sup>nd</sup> Change of scale

$T_p^\circ$  and Stress are applied at the level of oscillation marks

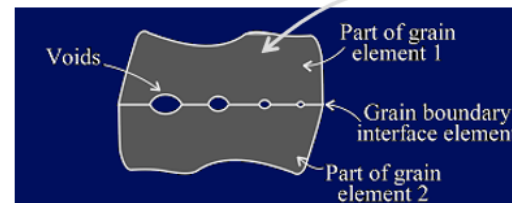
Macroscopic model



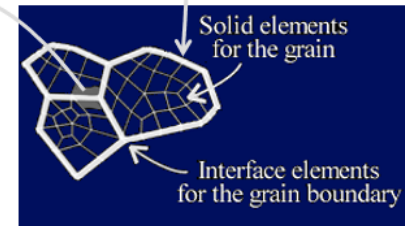
Mesoscopic cell



Grain boundary model



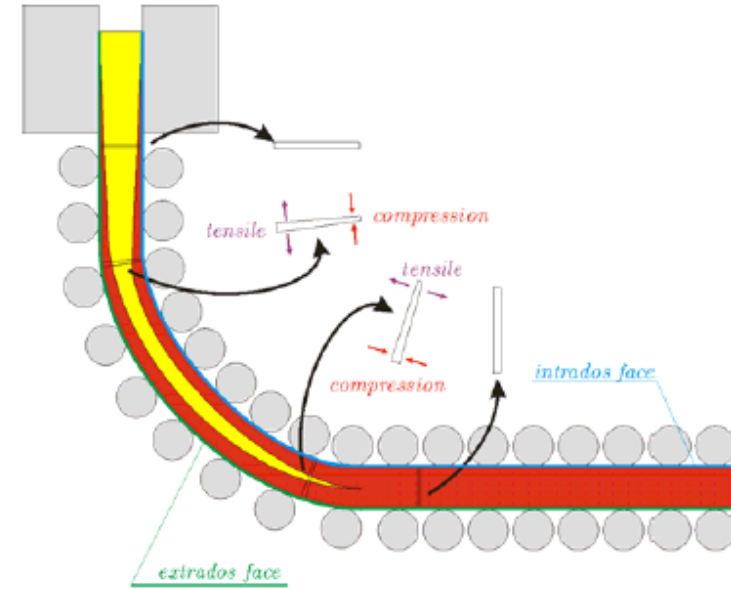
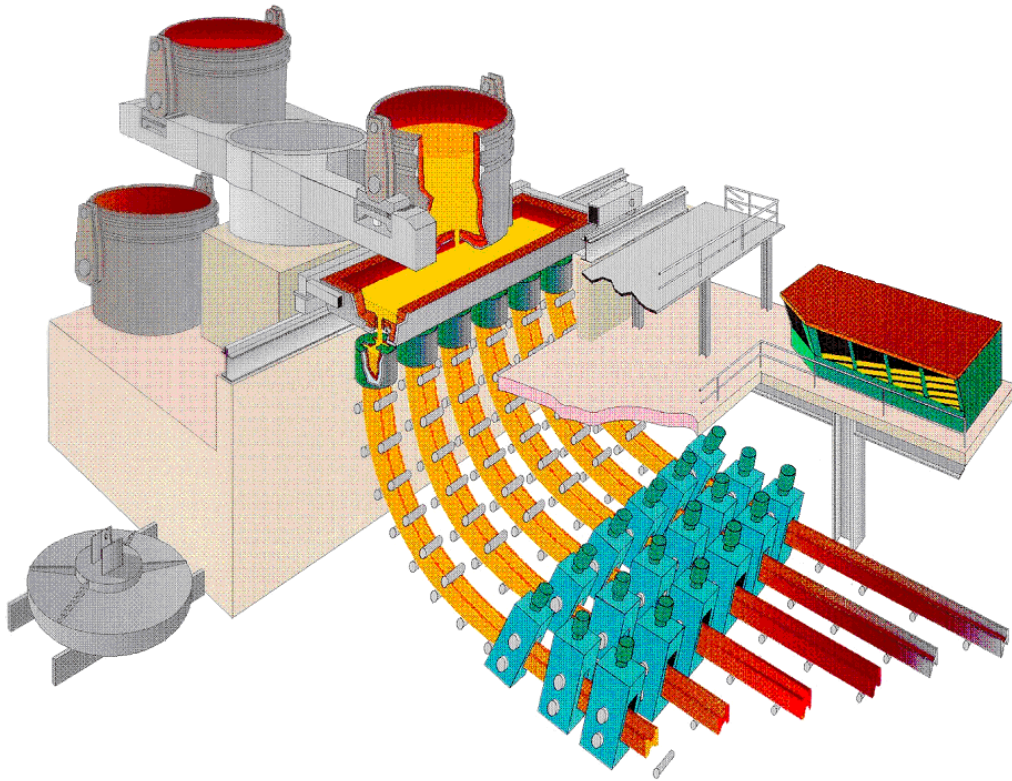
Grain model



# Continuous casting

## Methodology ?

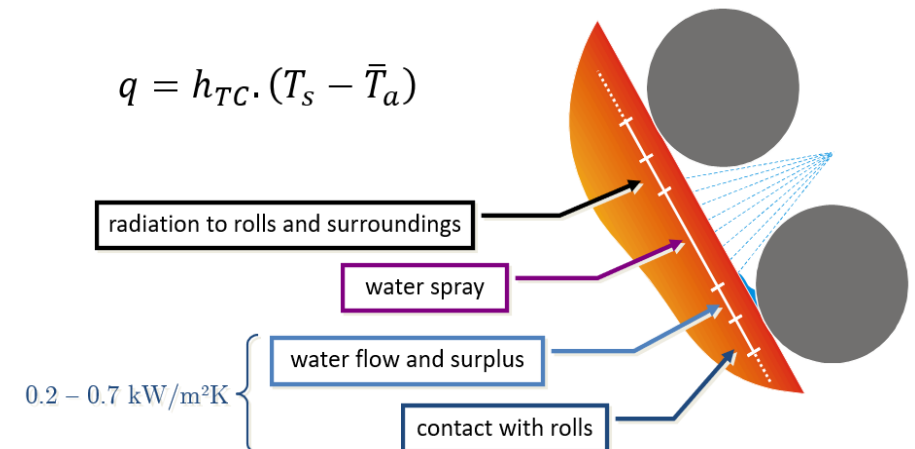
## 1<sup>st</sup> Get $T_p^\circ$ and Stress histories



## 1. Correct Thermal Field

Heat exchange in secondary cooling

$$q = h_{TC} \cdot (T_s - \bar{T}_a)$$

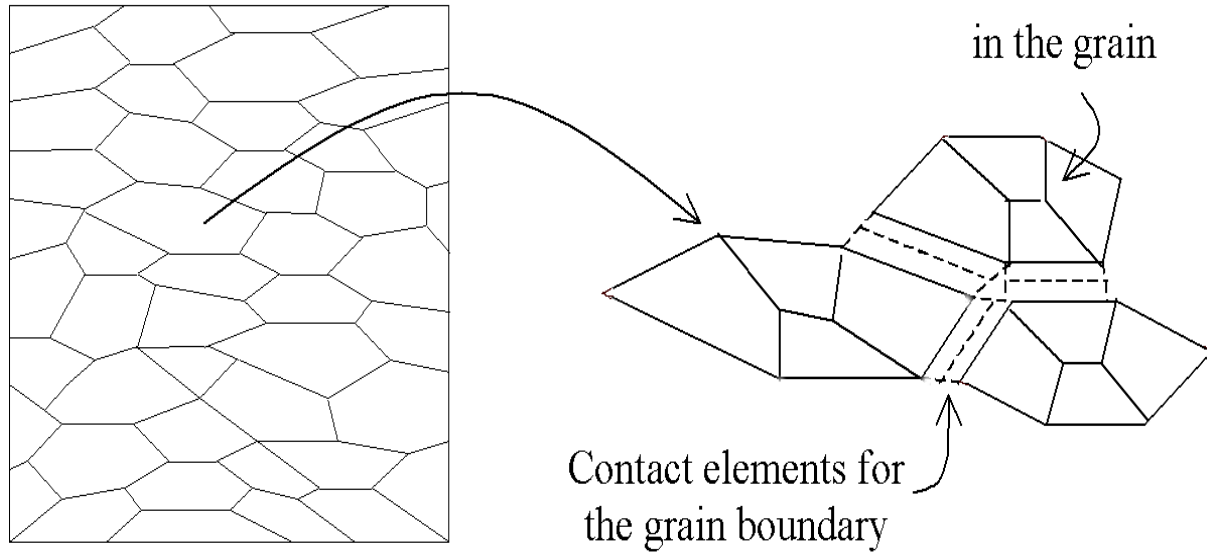


## 2. Staggered analysis

$T_p^\circ \rightarrow$  Meca  $\rightarrow T_p^\circ$  ....2.5D FE simulation for a plane going through the whole process



### 3. Change the scale → Mesoscopic Model

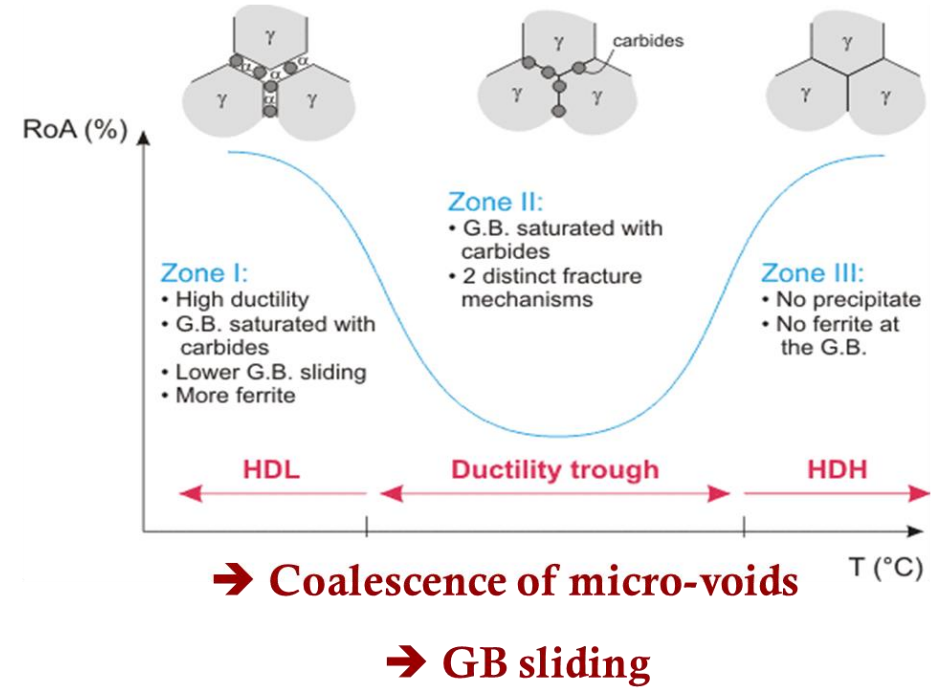


- **Grains** : quadratic elements with a **Norton-Hoff constitutive law**

$$\bar{\sigma} = \bar{\varepsilon}^{p_4} \cdot \exp(-p_1 \bar{\varepsilon}) \cdot p_2 \cdot \sqrt{3} \cdot (\sqrt{3} \cdot \dot{\bar{\varepsilon}})^{p_3}$$

- **Grain boundaries** : interface elements with a **damage constitutive law**

### Ductility curve



### 4 Peritectic steel grades

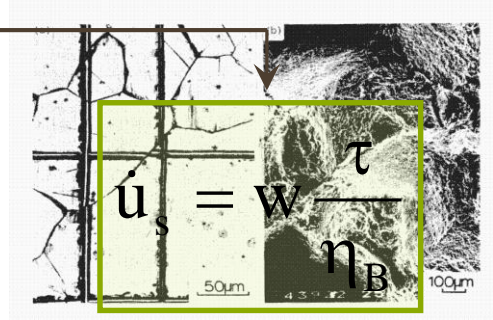
	V (ppm)	Nb (ppm)
Grade A	1	161
Grade B	60	139
<b>Grade C</b>	<b>550</b>	<b>565</b>

+Grade D : 0 V, Nb 370  
Carbone between grades C & D

# Damage law (Onck, van der Giessen 99)

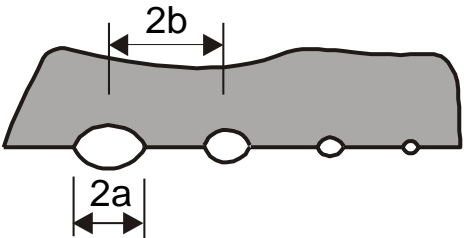
## ✓ Grain boundary sliding (Ashby)

$w$  = thickness of the grain boundary  
 $\eta_B$  = viscosity parameter  
 $\tau$  = shear at previous step

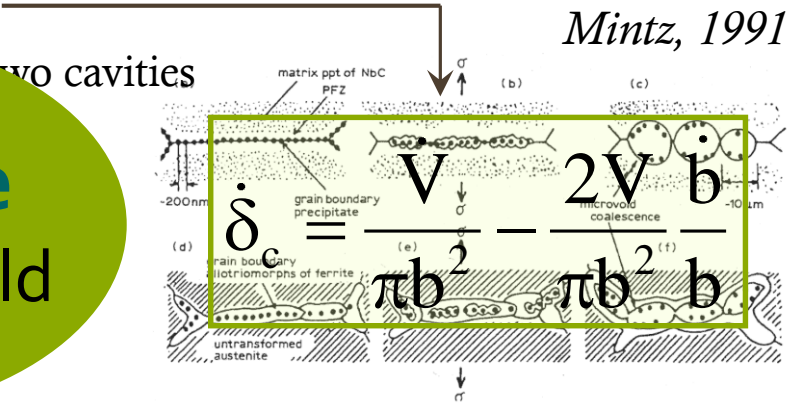


Suzuki, 1984

## ✓ Grain boundary cavitation



✓ **Damage**  
 $a/b = \text{threshold}$



Mintz, 1991

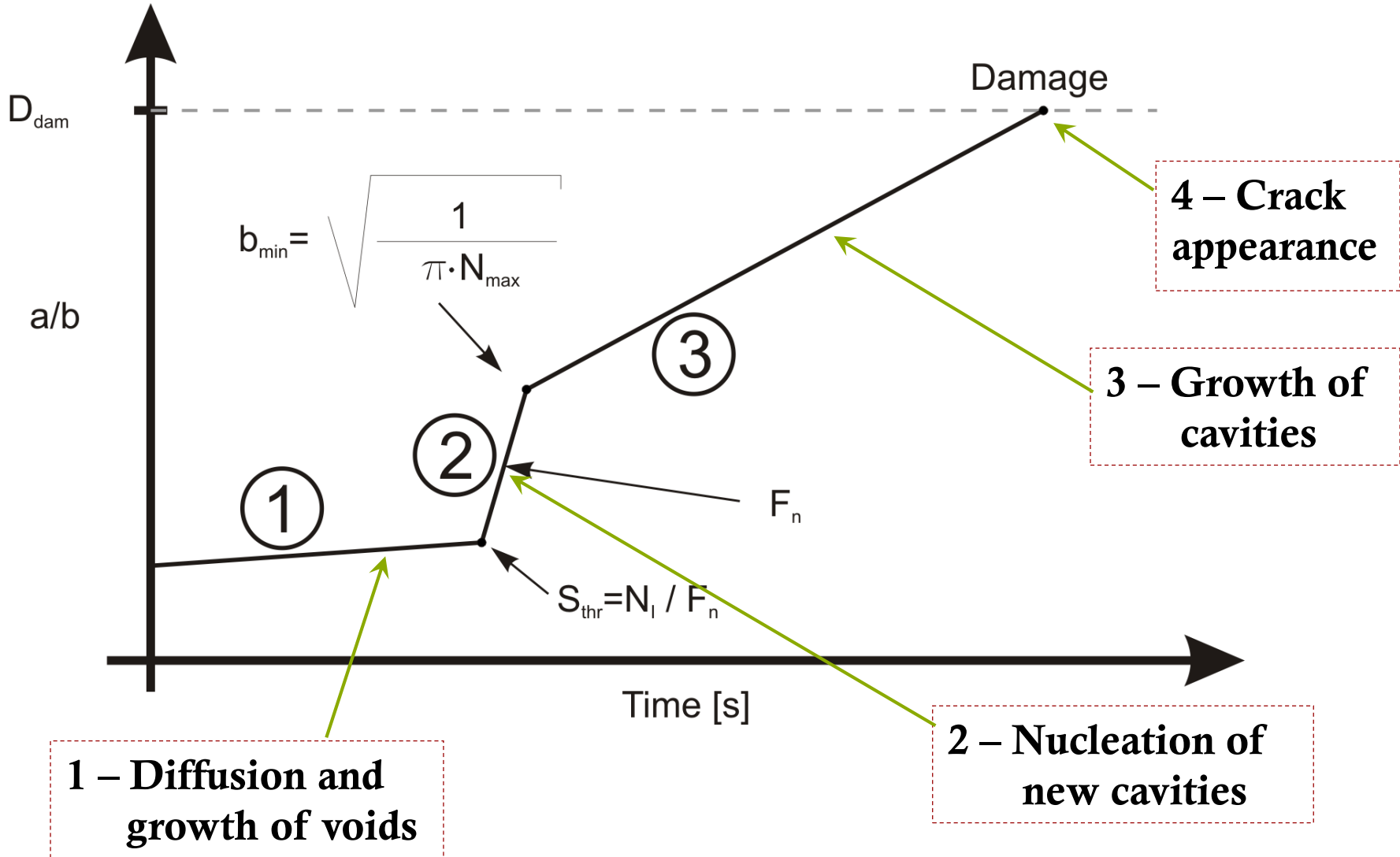
with

$$\begin{cases} \dot{V} = f(\dot{\epsilon}, \sigma_n, \sigma_m, \sigma_e, n, D, a, h) = \dot{V}_1 + \dot{V}_2 \text{ growth} \\ \dot{b} = f(\dot{\epsilon}, \sigma_n) \text{ nucleation} \end{cases}$$

by diffusion by creep

# Damage curve

a void size  
b void spacing  
at Grain Boundary



$F_n$  Nucleation parameter  
 $N$  Cavity density  
 $l$  initial, maximal

$N_I$  depends on Temperature

# Damage law data (14)

Identification thanks to

- Norton Hoff law
- Metallography
- Crack tests
- Literature

6 param. to extract from micrography but 4 not obtained

$d$   
 $\dot{\epsilon}_e^C / \dot{\epsilon}_B$   
 $n(T)$   
 $B(T)$

Mean grain size  
 Viscosity parameter  
 Creep exponent  
 Creep parameter

Grain boundary sliding

Initial cavities distance  
 Normalisation stress  
 Nucleation parameter  
 Initial density of cavities  
 Maximum density of cavities  
 Cavity angle or litterature  
 Initial size of the cavities

Nucleation of cavities

Diffusion parameter in the grain boundary  
 Atomic volume  
 Activation energy of diffusion in boundary  
 Rupture criteria

Cavity growth by diffusion and creep

4 param by inverse modeling of tensile notch tests or compression test with accoustic emission

$b_0$   
 $\Sigma_0(T)$   
 $F_n$   
 $N_i$   
 $N_{max}$   
 $\Psi$   
 $a_0$   
 $D_{b0} \delta_0$   
 $\Omega$   
 $Q_b$   
 $\left(\frac{a}{b}\right)_{crit}$

**14 → 6 → 4 parameters to determine**

# Results of this code chaining and limits

- ❖ **Physic based does not mean easy identification ... Inverse model required**
  - ❖ **need of** compression tests *with acoustic emission analysis* or tensile notched tests
  - ❖ + micrography + literature
- ❖ **Chemical composition effect on damage: OK**
- ❖ **Reliable results only for a realistic continuous casting stress and  $tp^\circ$  histories**
  - ❖ 3 successes: thermal discontinuities were taken into account
  - ❖ 1 failure:  $tp^\circ$  history received was “smoothed”
- ❖ **Oscillation marks effect, a process defect effect** (misalignment of 1 pair of rolls...)
  - **Process defects and grade effects can be analysed**

# Continuous Casting CC - References

**Pascon, F., & Habraken, A.** (2007). Finite element study of the effect of some local defects on the risk of transverse cracking in continuous casting of steel slabs. *Computer Methods in Ap. Mech. And Eng.*, 196, <https://doi.org/10.1016/j.cma.2006.07.017>

Generalized Plane strain 2D FE to model CC

**Castagne, S., Talamona, D., Habraken, A.** (2007). A damage constitutive law for steel elevated temperature. Identification of the parameters. *International Journal of Material Processing*, (1), 23-43. <https://hdl.handle.net/2268/19624>

**Schwartz, R., Castagne, S., & Habraken, A.** (2007). Numerical study to identify the material parameters of a damage model. *Computer Methods in Materials Science*, 7 (2), 237-242 <https://hdl.handle.net/2268/16210>

Implementation and identification of Onck damage model for hot tp°  
Onck, P., van des Giessen, E., 1999, *J. Mech. Phys. Solids*, 47(1), 99-139

Uliege PHDs are now available on ORBI (Castagne can be sent on request but paper)

Pascon <https://orbi.uliege.be/handle/2268/25500>

Schwartz <https://hdl.handle.net/2268/97124>

**J. K. Brimacombe and K. Sorimachi.** Crack formation in the continuous casting of steel. *Met trans B*, 1977.

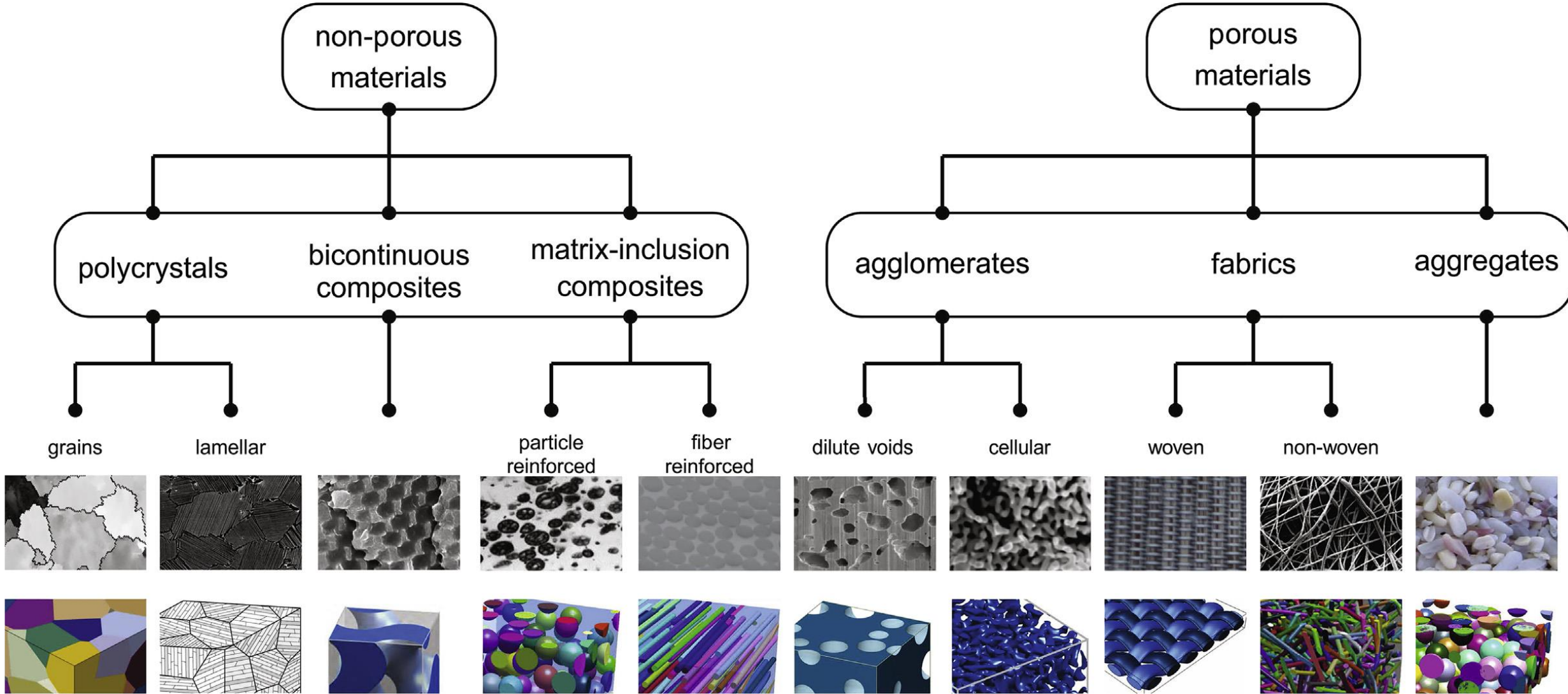
Reference about CC → issues and solutions based on practice and studies



# Contents

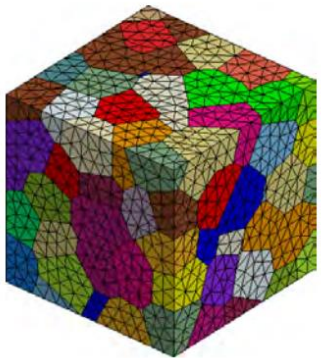
- ✓ A survey of scales and methods
- Finite element method FEM
  - ✓ One element: Solid Shell
  - ✓ Mechanical constitutive laws (multi scale ?)
    - ✓ Deep Drawing
  - ✓ Thermo-mechanical analysis
    - ✓ Cooling of rolling mills
    - ✓ Continuous casting
- **Representative Volume Element (RVE) or in French VER**
- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning
  - Additive Manufacturing

# Representative Volume Element --> a generic practice



# Representative Volume Element --> use ?

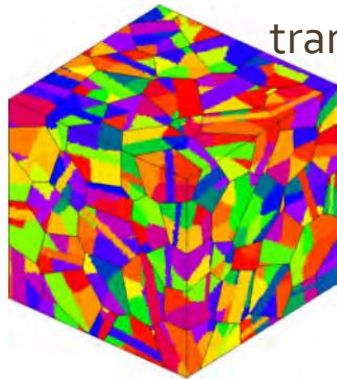
- To understand, to model behaviour, to identify 'phenomenologic laws'
  - static stress strain curves, anisotropy, elastic, plastic, viscoplastic behaviour
  - rupture, shear band, void nucleation growth propagation (static or fatigue)
  - creep, any damage ...



Parent  
austenite  
grains

**16MND5**

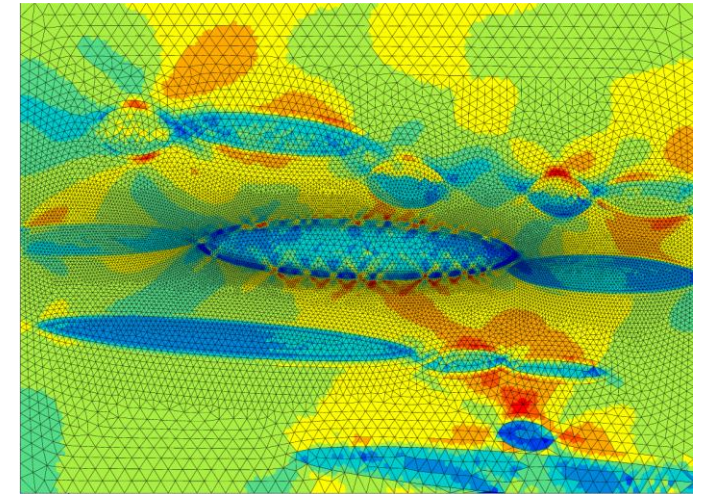
N. Osipov et al. *Matériaux 2006*



After Bainite  
transformation

Crystal PL.  
→ local stress  
& strain fields,  
→ inputs of  
cleavage  
models

FE  
CALCULATIONS  
OF PLUMES  
WITH VIRTUAL  
ANGLES  
PhD Kuzmenkov  
2012 Ecole des  
Mines **Ti6242**

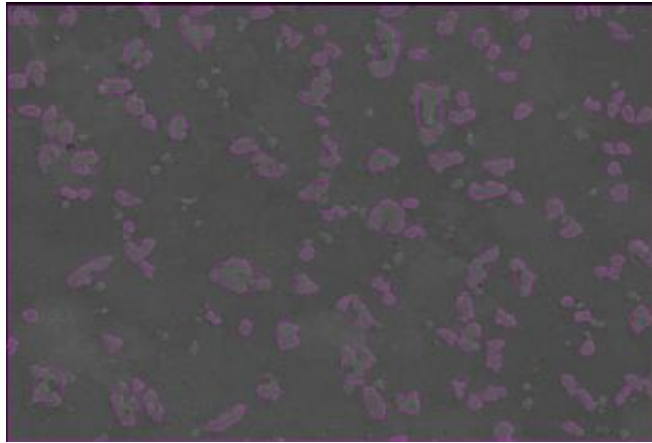


- To replace constitutive law in FE<sup>2</sup>
- Surrogate model within Artificial Intelligence → training of ANN, RNN, FFNN,.... **Today**

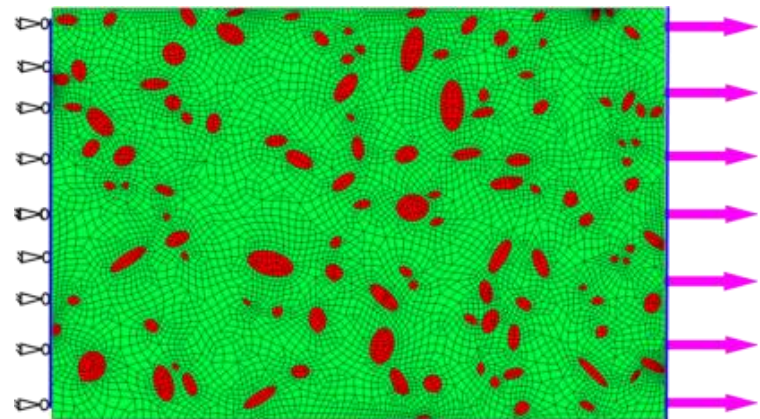


# Validation of a large RVE by tensile test

Exp. Microstr.  
Zhao et al.  
MSEA 2019



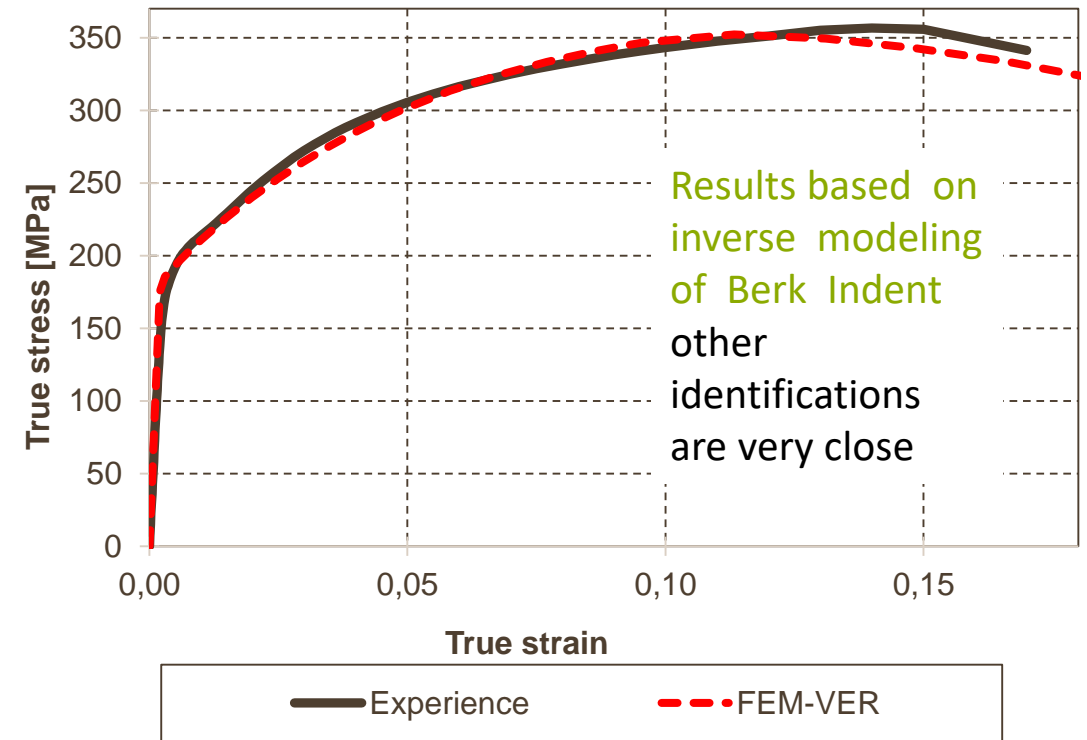
AlSi10Mg



No specific  
boundary  
Conditions  
A single Layer  
of 3D element



Si stays  
elastic

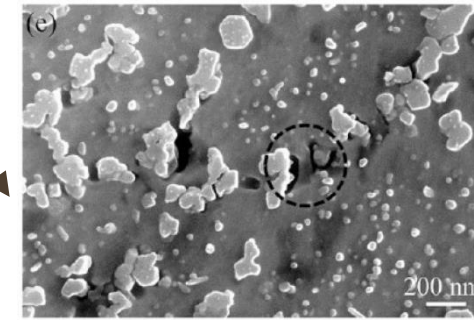
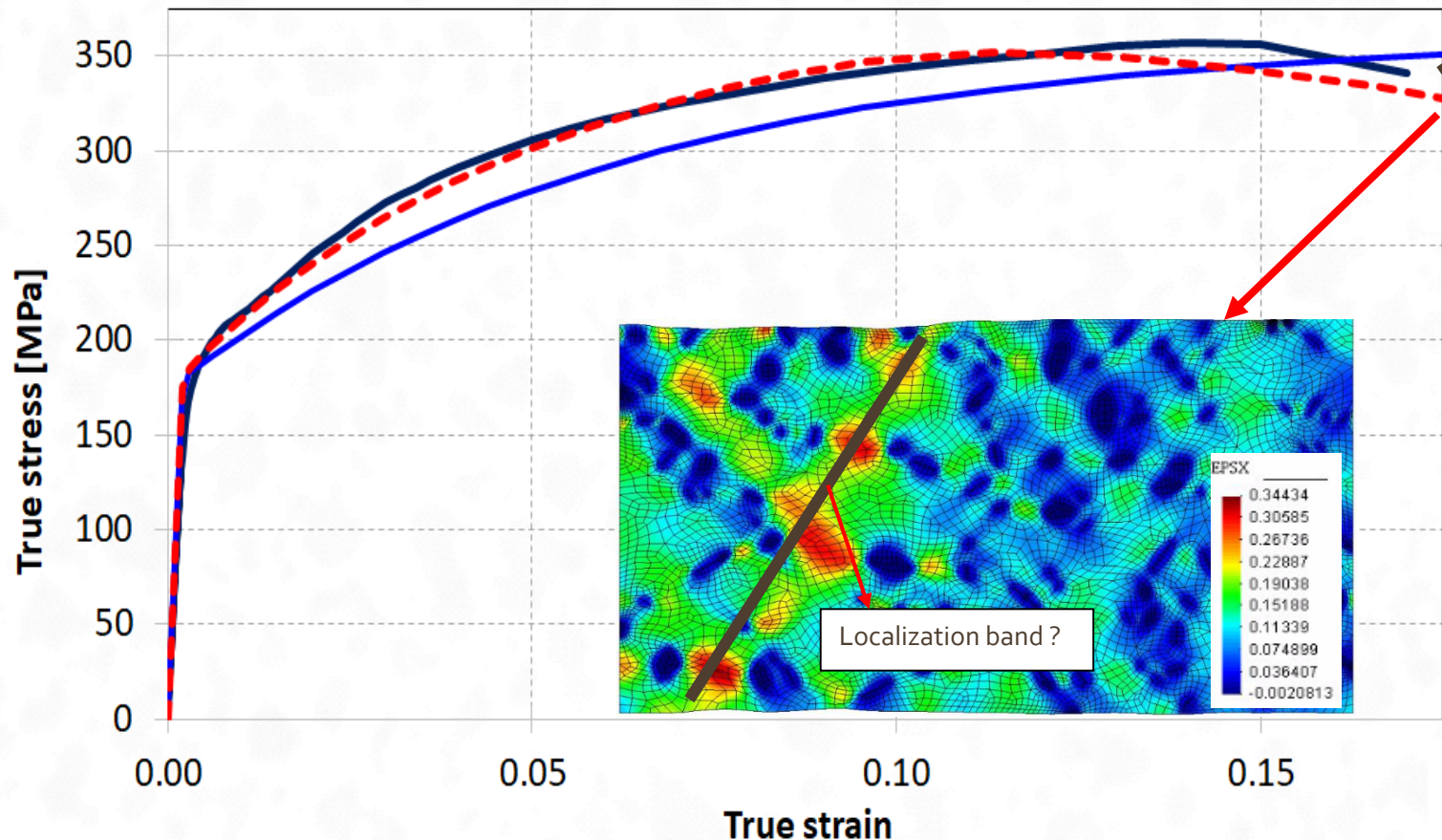


$\sigma_y$  of Solid solution of Al Si ??

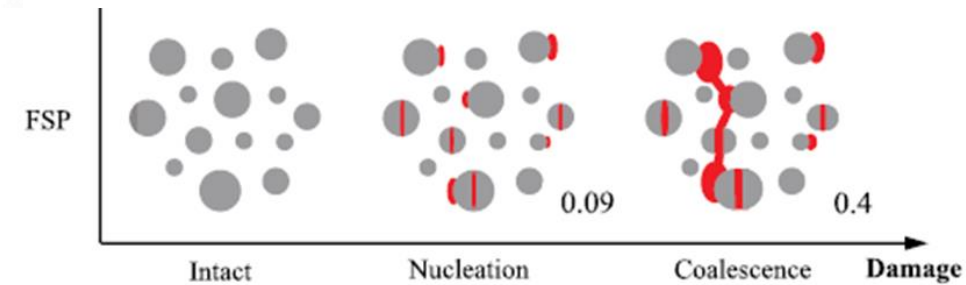
- Nanoindentation Bucaille, Exp approach 3 indents (Dedry 2021 ESAFORM)
- ➔ ▪ Inverse modelling - Berkovich indent - care about particle interactions
- Analytical formula + DL Borlaf master thesis 2023

H.S. Tran, C. Bouffieux et al. Materials and Design 2022

# Validation of large RVE by tensile test



ductile failure with damage nucleation sites  
 = mainly particle-matrix decohesion  
 (Zhao et al. MSEA 2019)



H.S. Tran, C. Bouffioux et al. Materials and Design 2022

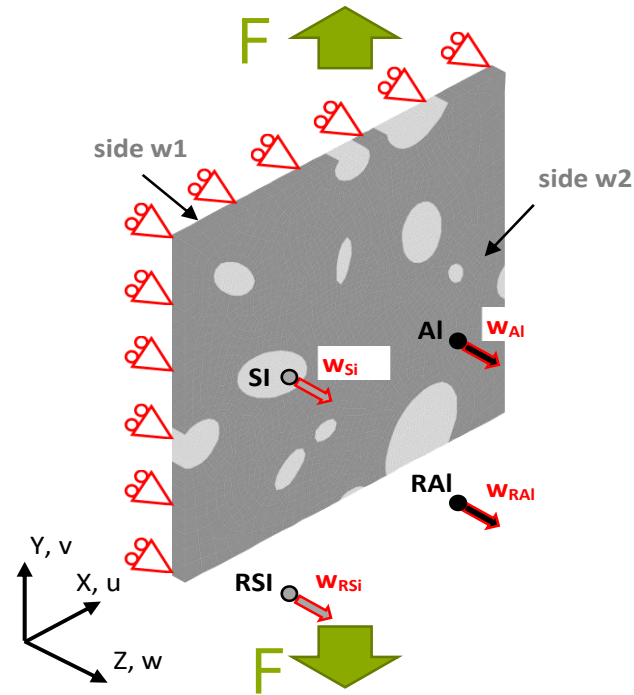
→ Need of cohesive elements to capture real rupture mechanism, current RVE OK until 0.08 strain

# Small 2.5D RVE - Details

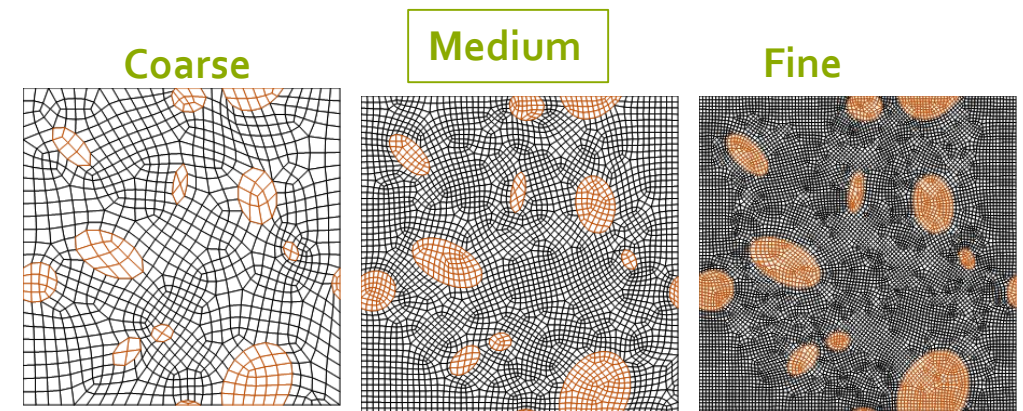
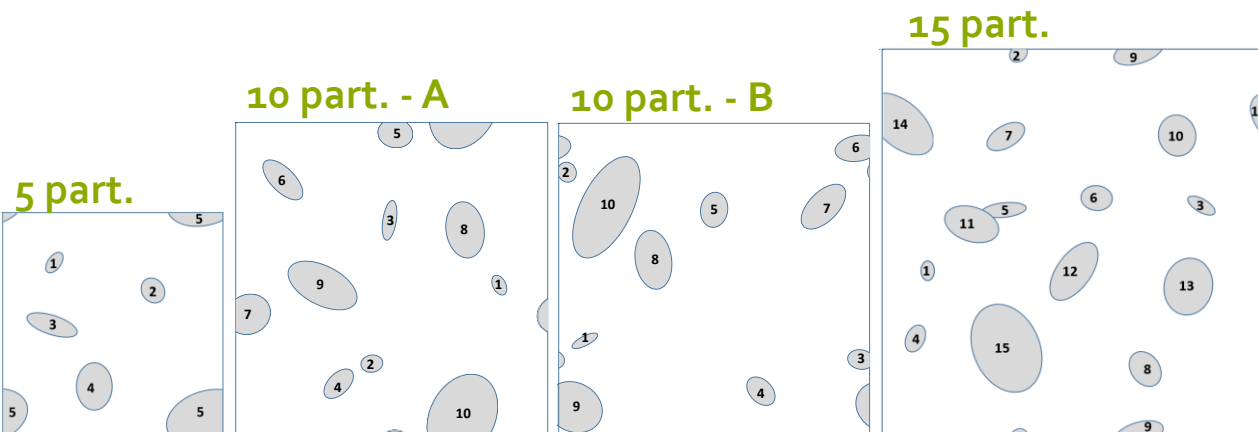


2D or 3D ? → 2.5D

- Particles: statistically representative
- Out-of-plane stiffness adjustment
- Same behavior: num. & exp.
  - Representative size: 10 particles
  - Optimum mesh density: Medium
  - Out-of-plane stiffness adjustment

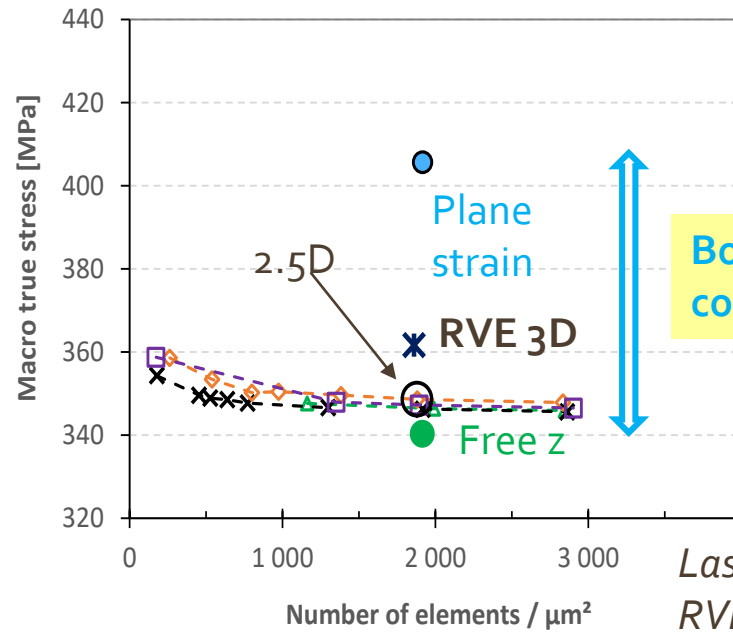
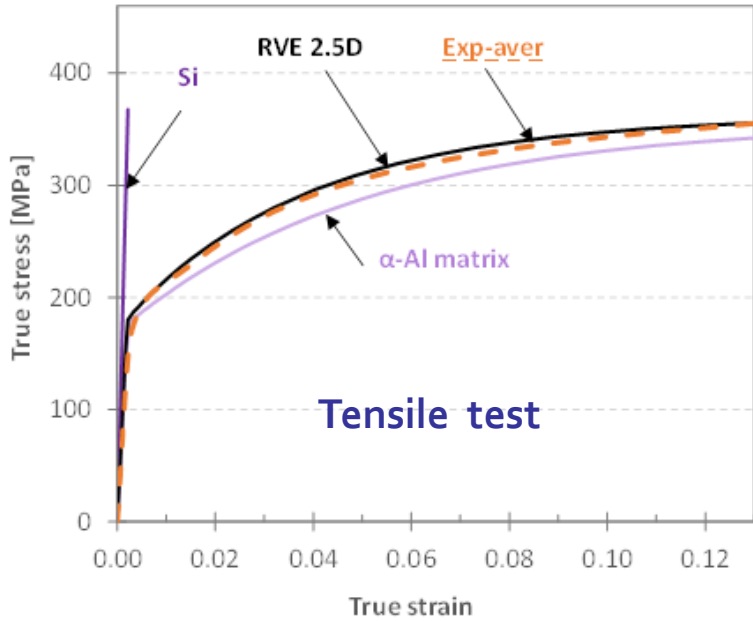


- Target: representativity of a macro tensile test in Y dir.
- Macro level :  $\epsilon_{XX} \approx \epsilon_{ZZ}$  isotropic material
- Local level:  $\epsilon_{ZZ}$  identical for all particles
- Interface: Cohesive elements
- Bouffioux et al. ESAFORM 2022



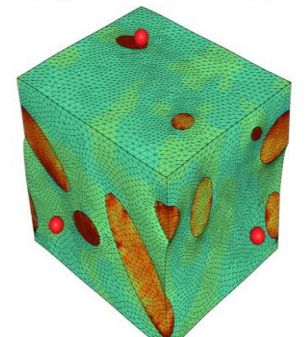
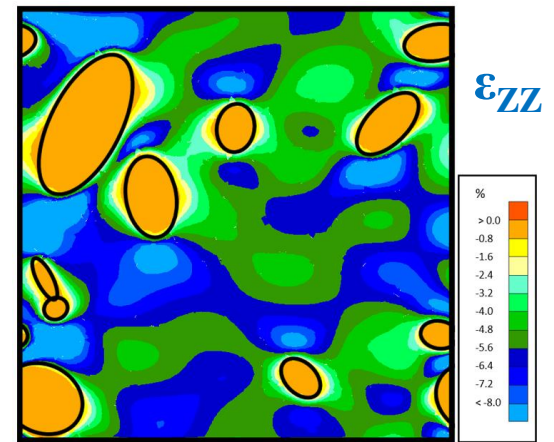
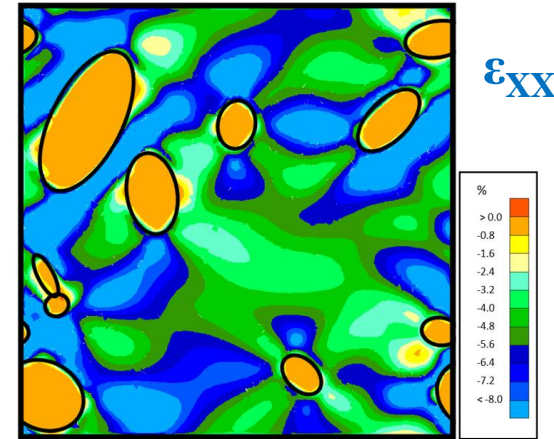


# Smaller RVE with periodic boundary



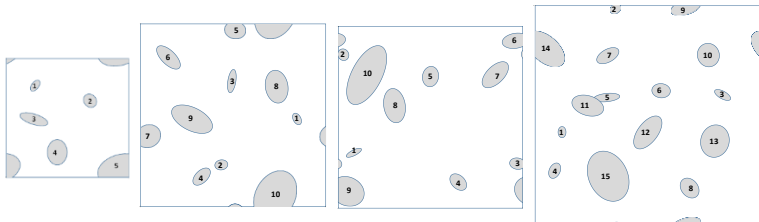
Boundary condition effect

Last result tuning ↓  
RVE 3D and 2.5D differences



## Comparison of all simulations

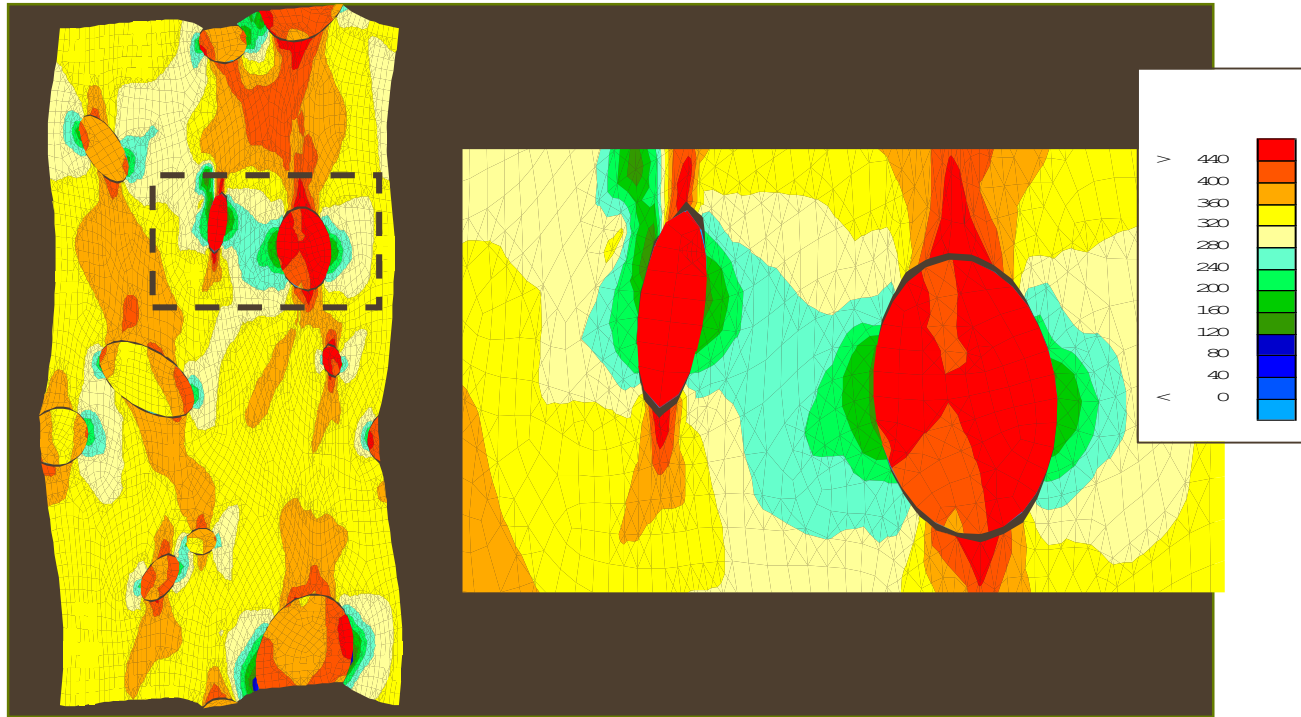
△ Small × Medium-A ◇ Medium-B □ Large



Poor macro stress effect between Free Z, 2.5 D, 3D RVE  
**Exp between 2.5D and 3D RVE**  
RVE plane strain too stiff  
Effect on local stress ?

2.5D // 3D RVE (in average) –  
Absolute max values depend on particle distribution

# Validation of small 2.5D RVE with Periodic Boundary conditions & cohesive elements

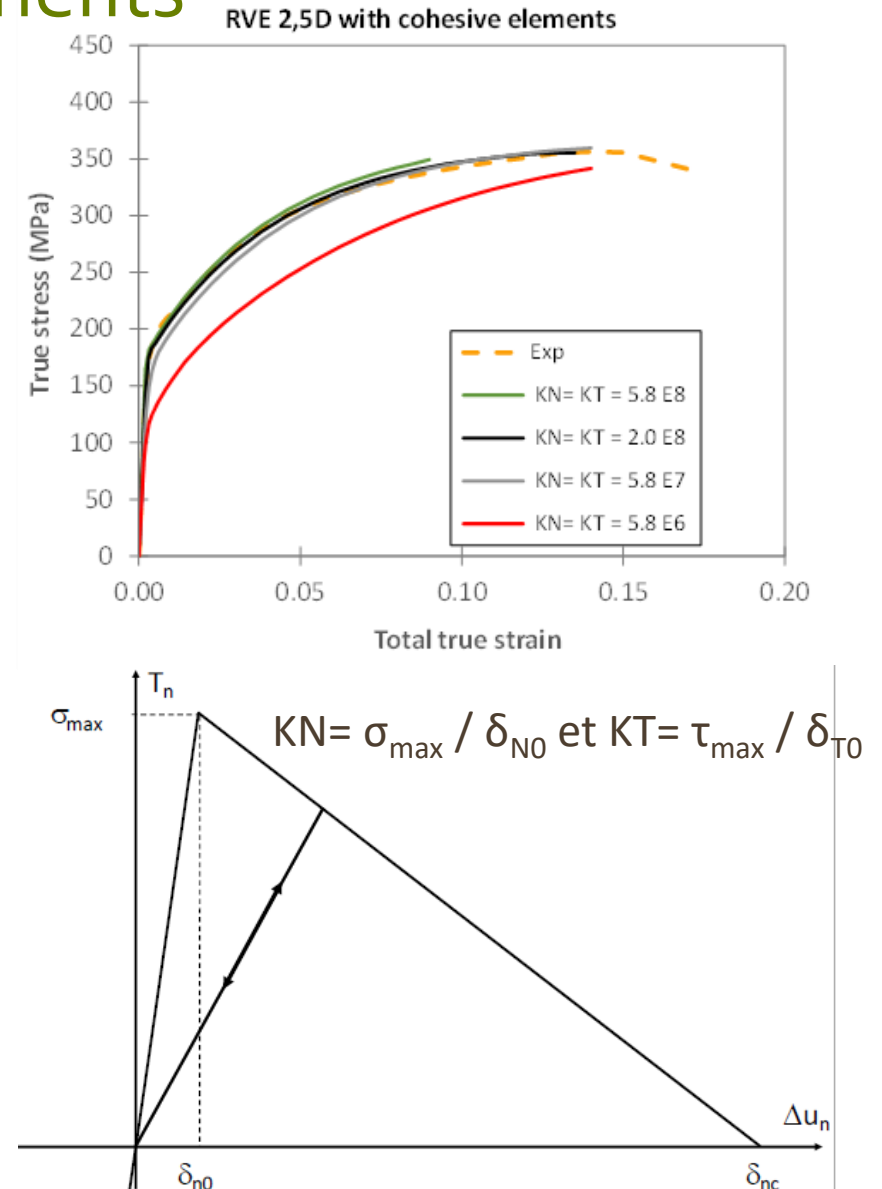


Stress in tensile direction [MPa] at macro strain of 10 %.

Displacement x 10 to enhance decohesion.

Identified set of parameters

same strength in tensile and shear decohesion → tensile decohesion first



# Representative Volume Element references

Generation of 3D representative volume elements for heterogeneous materials: A review **S. Bargmann et al.** *Progress in Materials Science* 96 (2018)  
<https://doi.org/10.1016/j.pmatsci.2018.02.003>

About RVE FE mesh generation

FE<sup>2</sup> Computations with Deep Neural Networks: Algorithmic Structure, Data Generation, and Implementation **Eivazi H.** 2023 *Mathematical and Computational Applications*  
<https://doi.org/10.3390/mca28040091>

Concept Equations Academic example

Déc 2007 : **Nikolay Osipov** PhD Génération et calcul de microstructures bainitiques, approche locale intragranulaire de la rupture Paris Ecole Centrale - not open?  
→ First steps Numerical generation and study of synthetic bainitic microstructures *Matériaux 2006*, Dijon, France.  
[hal-00144530](https://hal.archives-ouvertes.fr/hal-00144530)

Déc 2009: **Thibault Herbland** PhD Une méthode de correction élastoplastique pour le calcul en fatigue des zones de concentration de contraintes sous chargement cyclique multiaxial non proportionnel  
<https://pastel.hal.science/tel-0047999>

Cailletaux's RVE use to study phenomena

Juin 2012 **K Kuzmenkov** PhD Etude de l'effet du temps de maintien sur le comportement et la rupture (effet Dwell) de l'alliage base Ti6242

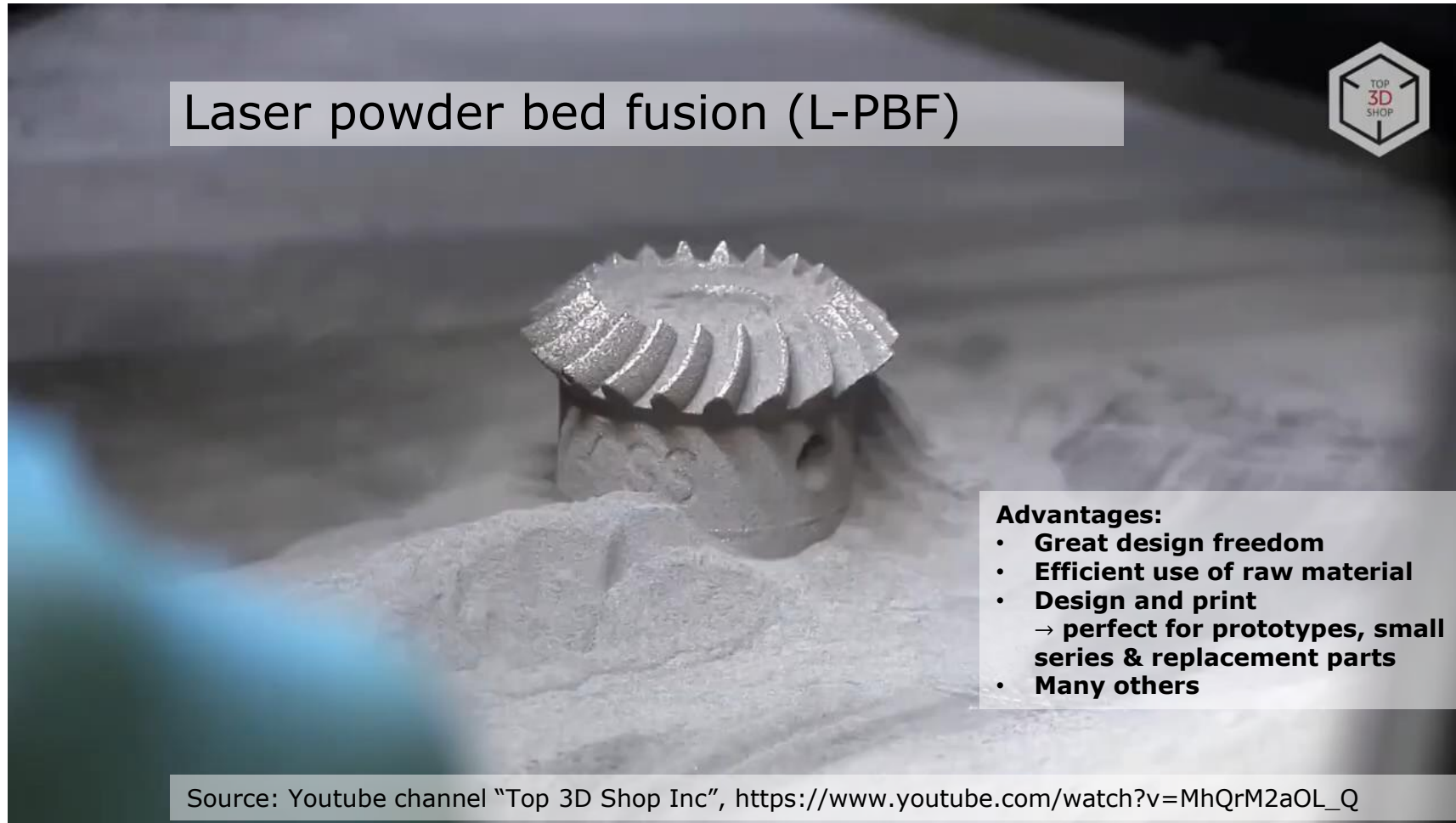
See also Forest S. and so many....

# Contents

- ✓ A survey of scales and methods
- ✓ Finite element method FEM
  - ✓ One element: Solid Shell
  - ✓ Mechanical constitutive laws (multi scale ?)
    - ✓ Deep Drawing
  - ✓ Thermo-mechanical analysis
    - ✓ Cooling of rolling mills
    - ✓ Continuous casting
  - ✓ Representative Volume Element (RVE) or in French VER

- Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning
  - Additive Manufacturing

# Additive Manufacturing



Courtesy of  
Dr. B.J. Bobach

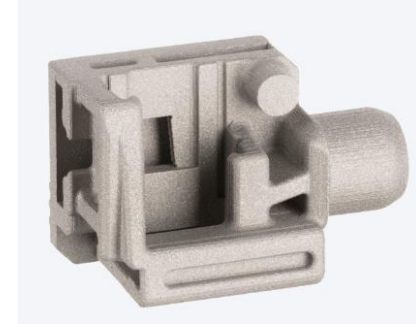
PhD 2023  
under  
J.P. Ponthot  
supervision  
Ulège

PhD Oct 2023

Time > 9 min (end advertisement but before good introduction to L-PBF)



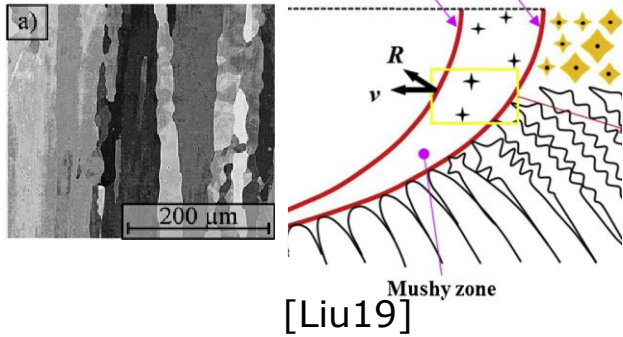
# Typical length scales → a choice



## Micro-scale

Resolves grain structure

- Anisotropic grain growth (e.g. dendrites, columnar grains)
- Anisotropic material behavior

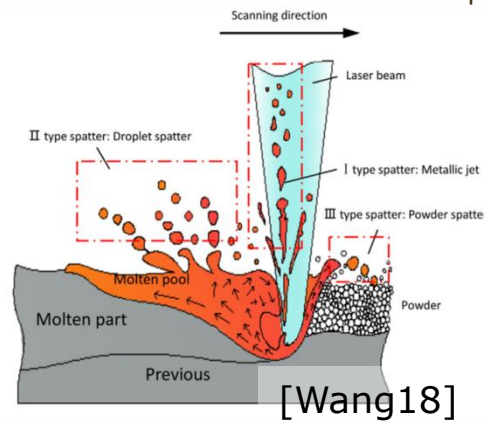


[Kör14]

## Meso-scale

Resolves melt pool

- Heat source interaction
- Melt front advancement
- Convective flow
- Localized residual stresses
- Powder effects, spatter
- Keyhole formation

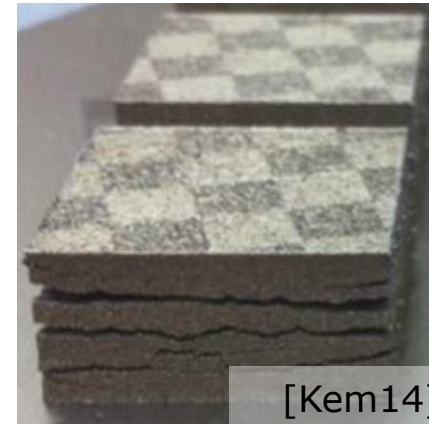


[Wang18]

## Macro-scale

Resolves whole part

- Whole process
- Thermal history
- Overall residual stress
- Part distortion



[Kem14]

[Liu19] P. Liu et al., Insight into the mechanisms of columnar to equiaxed grain transition during metallic additive manufacturing, Additive Manufacturing 26, 2019,

[Kör14] C. Körner et al., 2014, Tailoring the grain structure of IN718 during selective electron beam melting. MATEC Web of Conferences.

[Wang18] D. Wang et al., Mechanisms and characteristics of spatter generation in SLM processing and its effect on the properties, Materials & Design, vol. 137, pp. 33–37, Jan. 2018,

[Kem14] K. Kempen et al., SLM of Crack-Free High Density M2 High Speed Steel Parts by Baseplate Preheating, Journal of Manufacturing Science and Engineering, vol. 136, p. 131-139, 2014.



# Which model type ? Goal = Part quality (with low porosity)

→ **Computational Fluid Dynamics**  
(Meso-scale)

First what is porosity origin....

- (A) Entrapped gas porosity (Keyhole);
- (B) Incomplete melting-induced porosity;
- (C) Lack of fusion with unmelted particles inside large irregular pores

(D) Cracks

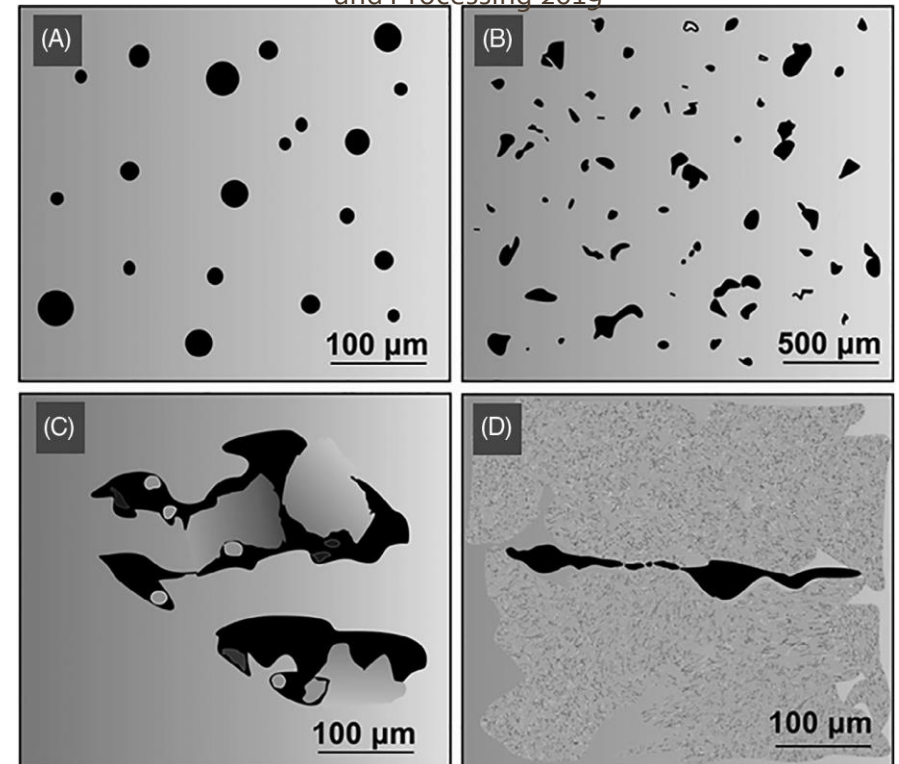
→ **Solid Finite Element**

- Either accurate finite element thermo-mechanical analysis
- Or inherent or eigen-strain-method + contour method (calibration)

→ Or Analytical formulae if very simple shape....

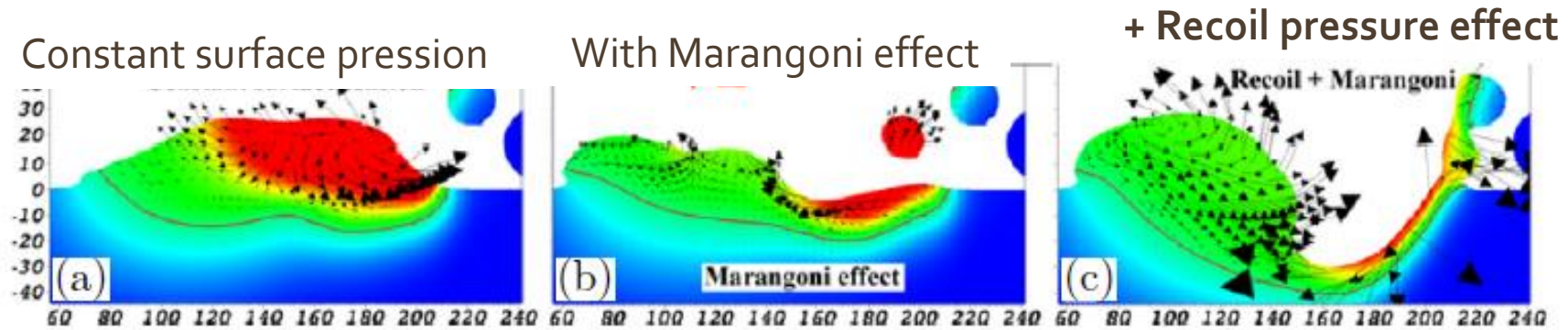
→ Or  
(Macro-scale)

A. Sola A Nouri Wiley  
Advanced manufacturing  
and Processing 2019



# Not a simplified CFD code

## Surface tension, Marangoni, recoil pressure



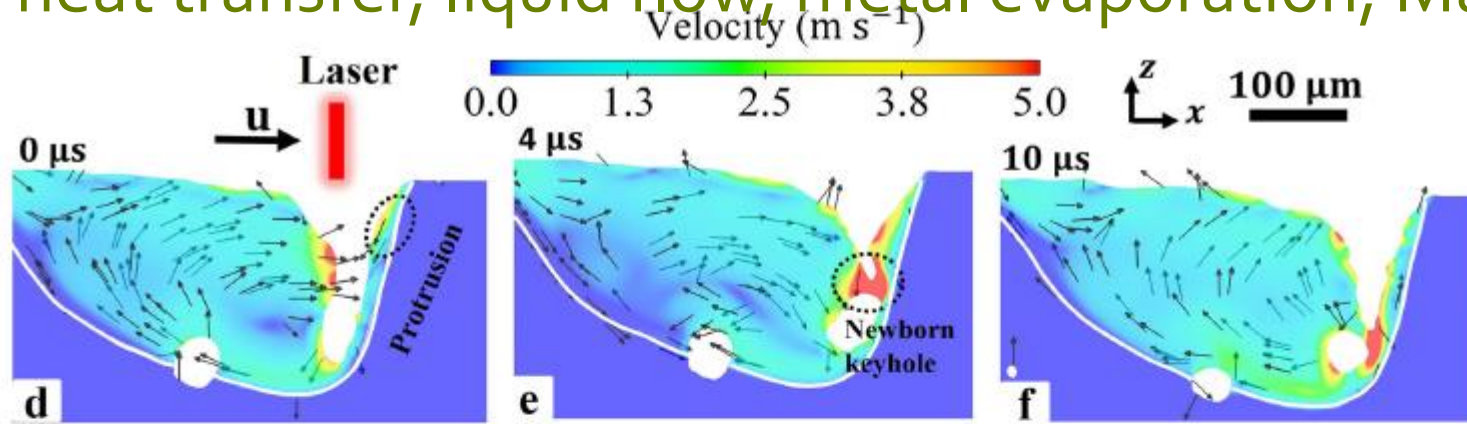
S. A. Khairallah, A. T. Anderson, A. Rubenchik, and W. E. King. Laser powder-bed fusion additive manufacturing: Physics of complex melt flow and formation mechanisms of pores, spatter, and denudation zones. *Acta Materialia*, 108:36–45, 2016.

- convection-related terms
- (Marangoni)
- recoil pressure

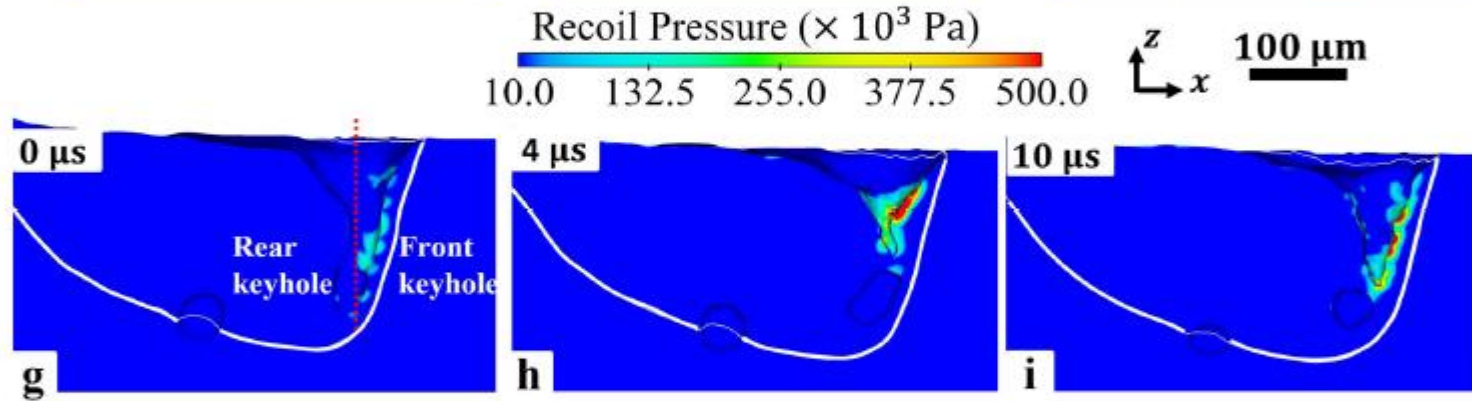
Essential features in a CFD model for AM

# CFD model with heat transfer, liquid flow, metal evaporation, Marangoni effect, Darcy's law

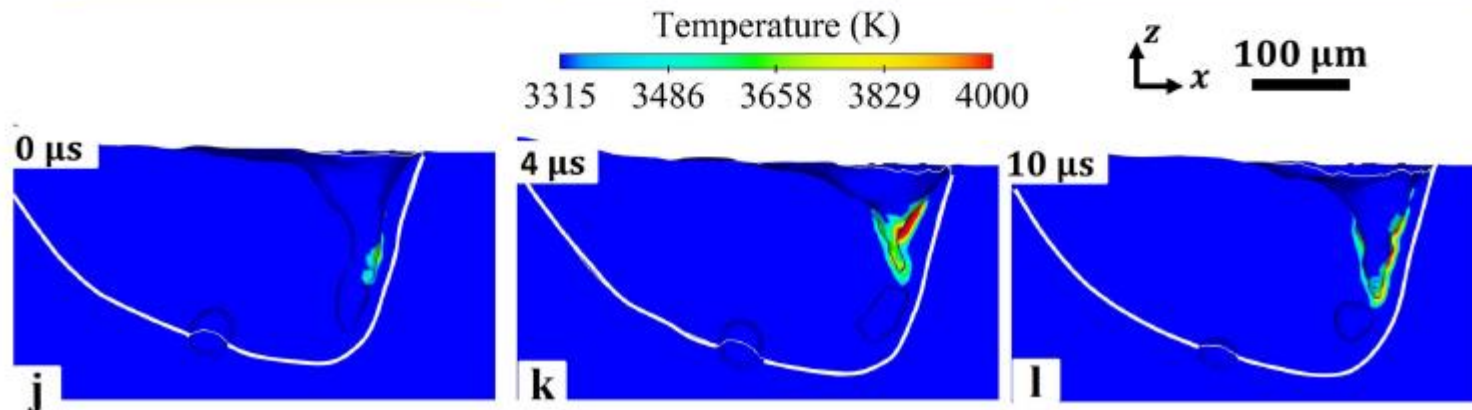
Velocity



Recoil Pressure



Temperature



Wang et al.  
Computational Materials  
(2022)

# Which model type ? Goal = Microstructure prediction

1. Accurate Finite Element Thermo (Mechanical) analysis
2. Post processing or coupled analysis ( $T_p^\circ$  Field + Metallurgy)

→ phenomenological based Johnson-Mehl-Avrami-Komlogorov or Koistinen-Marburger models...

**Macro-scale**

→ Phase Field models (micro scale - thermodynamic laws)

→ Cellular Automata approach (CAFE)

→ Deep learning approaches (DL Deep Learning & its acronyms)

**Micro-scale**

## Real challenge: lack of data and knowledge

- high temperature cooling rate and heating rate
- multiple cycles (remelting or just heating + cooling) → strong out of equilibrium microstructures
- complexity: phases, morphology, distribution, heterogeneity

# FE variants for Additive Manufacturing

- FEM models with birth elements



or Approach with all elements there and property variation ?

2<sup>nd</sup> choice less accurate: COMSOL has both and it can be checked.



- Thermal model associated to liquid within solid FE elements?

Assumption about thermal properties within melt pool

→ “Marangoni effect” : multiplying real conductivity

- Rheological model?

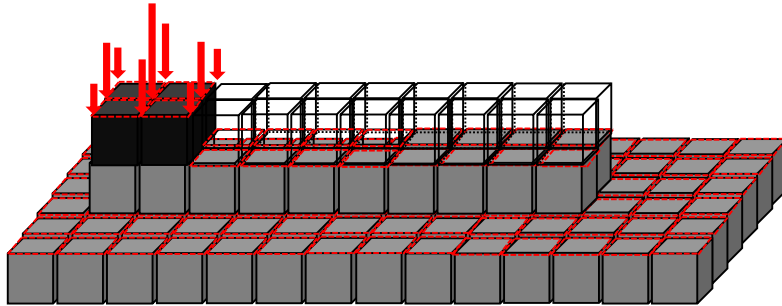


Elasticity → Elasto Visco Plasticity with metallurgy...

Experimental calibration is strongly different

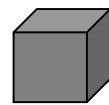
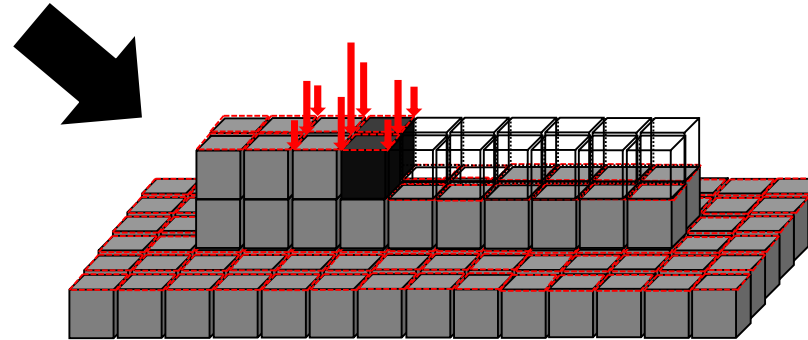


# Element birth technique

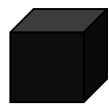


Variable number of elements, node, DOF  
Heat flow and new material simulated by 2 to 9 elements  
Boundary conditions = interface elements  
adapted to solid element

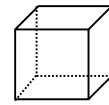
**For a thin wall 3D  
Bulk Sample 2D**



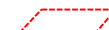
Active element



Newly active element



Inactive element

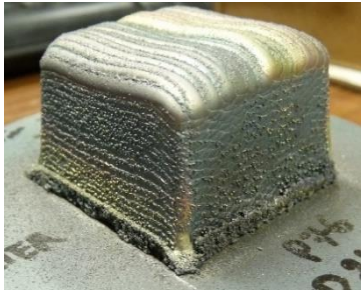


Convection and radiation element

Element size defined by laser beam size !  
→ Direct mesh convergence  
→ Mesh variable density by GMSH

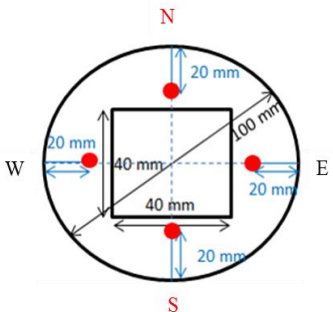
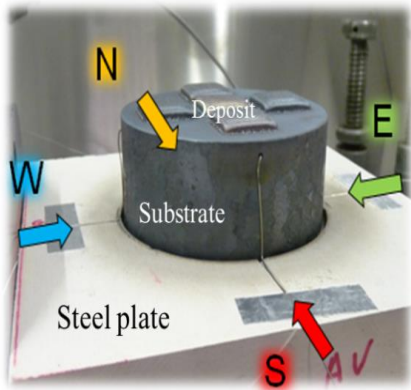
Convection-radiation elem. on vertical planes of the clad not drawn

# Bulk sample M4 high speed steel



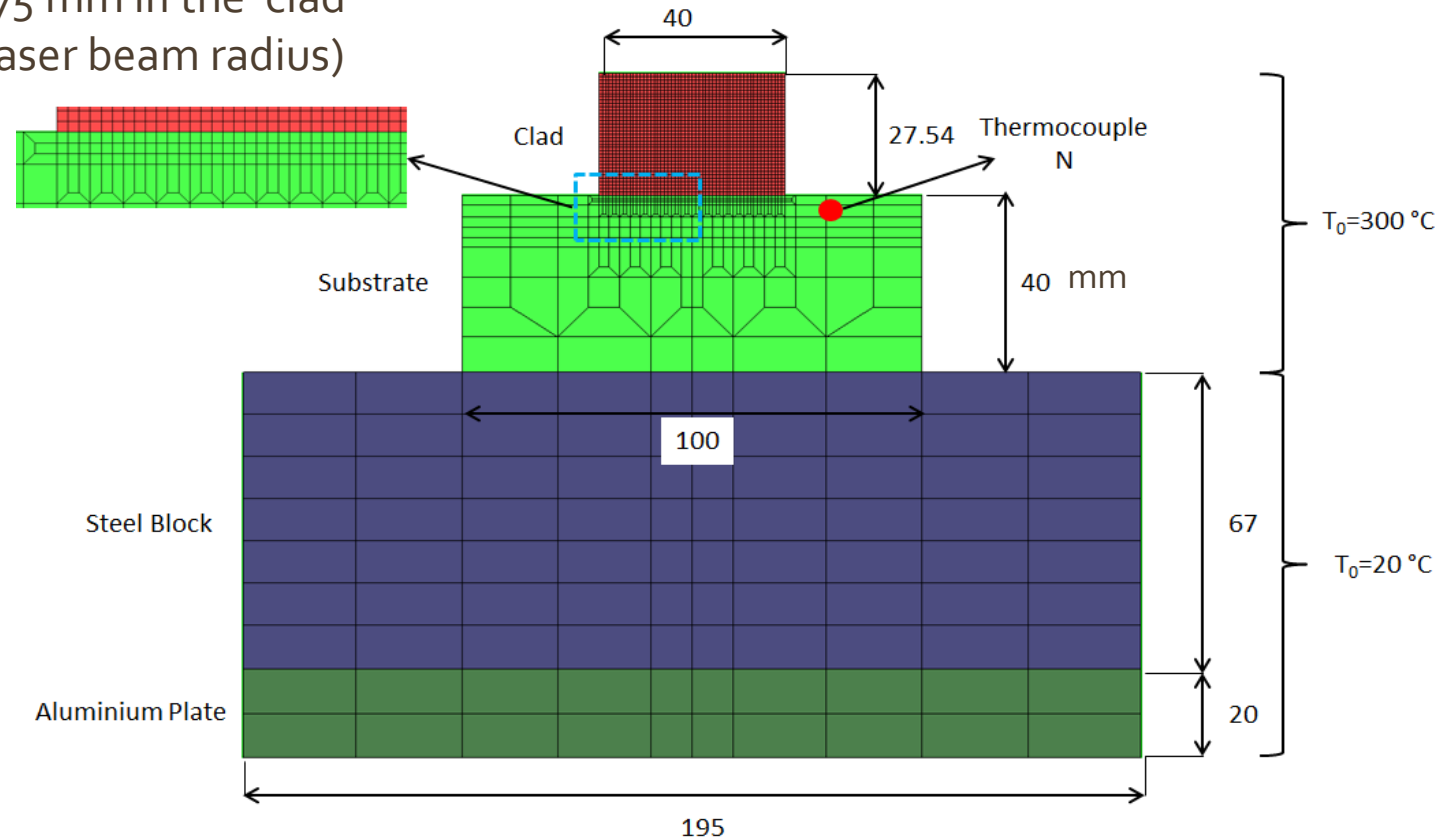
40 x 40 x 27.5 mm  
(874 tracks)

4 Thermocouples  $T_p(\text{time})$



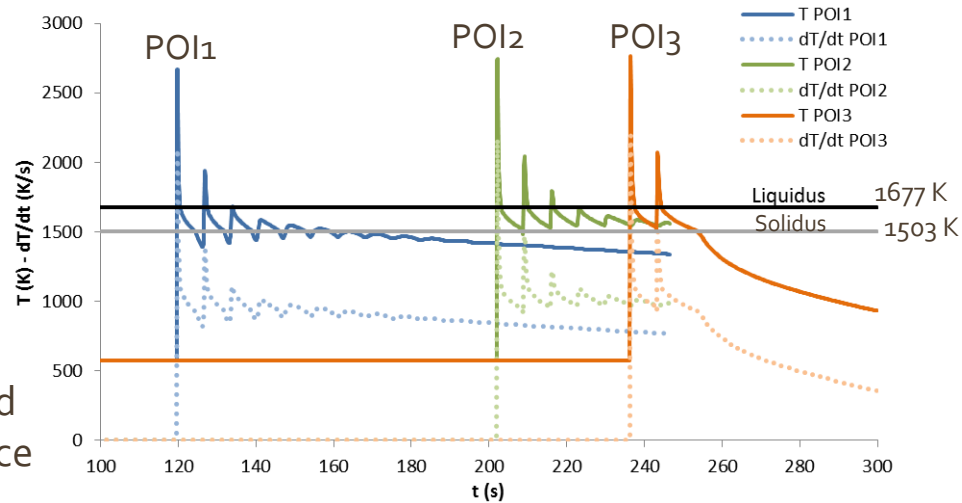
## 2D FE Mesh

Mesh element size  
0.75 mm in the clad  
(Laser beam radius)

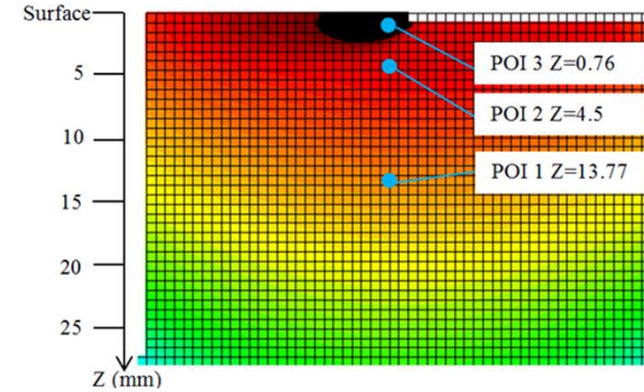


Simple thermal model  
It needs good identification  
to reach good results

# FE Tp field & history in the clad (constant laser power)



substrate  
pre-heated  
in a furnace

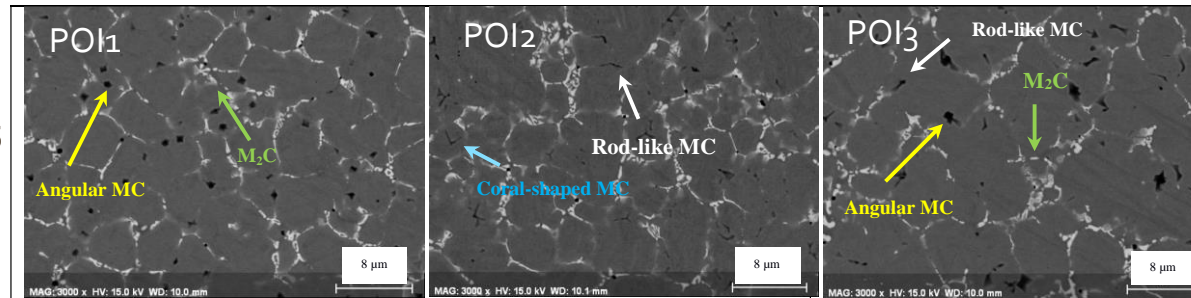


Jardin et al Materials Letters 2019

- Number of full partial remelting
- Tp° Level between solidus & liquidus
- Superheating temperature

## Validations :

1. Thermocouples
2. Melt pool size of last layer
3. Microstructure



star-like MC  
lamellar eutectic  $M_2C$   
intercellular carbides

coral-shaped intracellular  
MC,  
intercellular eutectic  $M_2C$   
and refined cells due  
to multiple melting

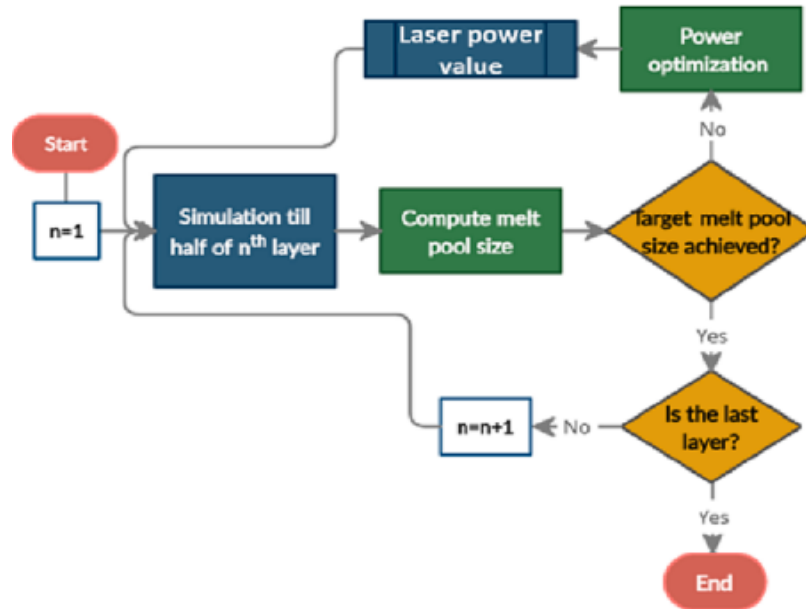
coarse angular MC  
eutectic  $M_2C$  within  
intercellular zones  
larger cell

# Laser power optimization to ↗ microstructure homogeneity

## 1<sup>st</sup> METHOD

Newton Raphson algorithm such that melt pool = ct value

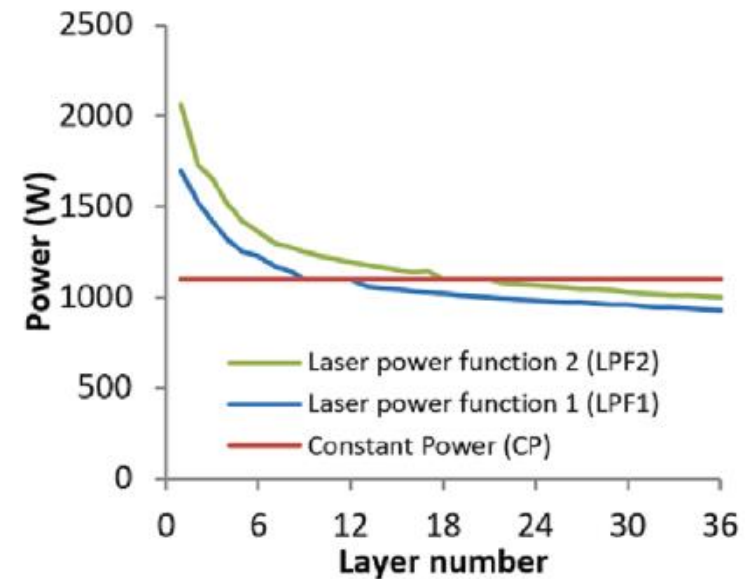
Two different constant values → Laser Power Functions LPF1 and LPF2



Melt pool size target:

LPF 1 → 1.4 mm depth, 4.4 mm length

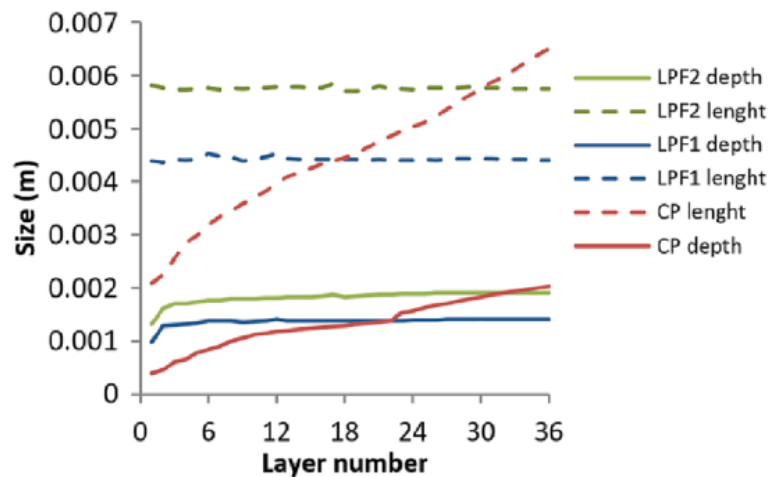
LPF 2 → 1.8 mm                      5.7 mm



Jardin et al. Optic & Laser technology 2023

# Hardness measurements confirm homogeneity

## Predicted melt pool depth & length



Constant target depth = assumption for constant  $tp^\circ$  history  
 → homogeneous microstructure

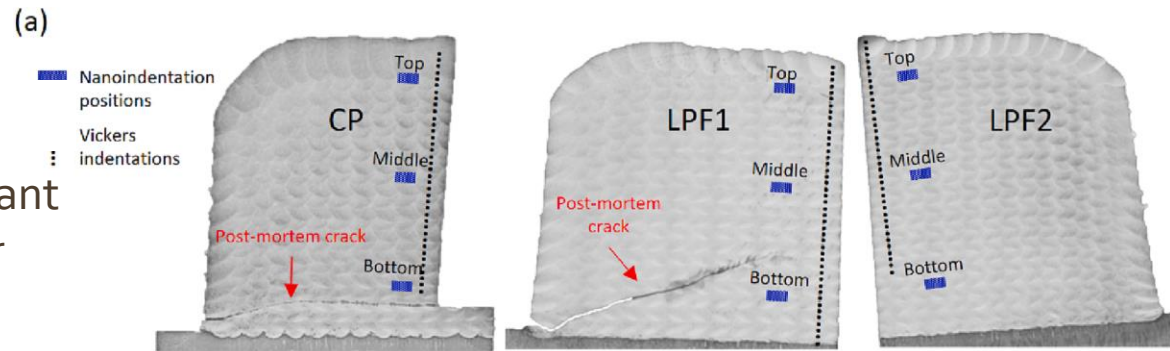
LPF 1 → 1.4 mm depth, 4.4 mm length  
 LPF 2 → 1.8 mm                      5.7 mm

Jardin Optic & Laser technology 2023

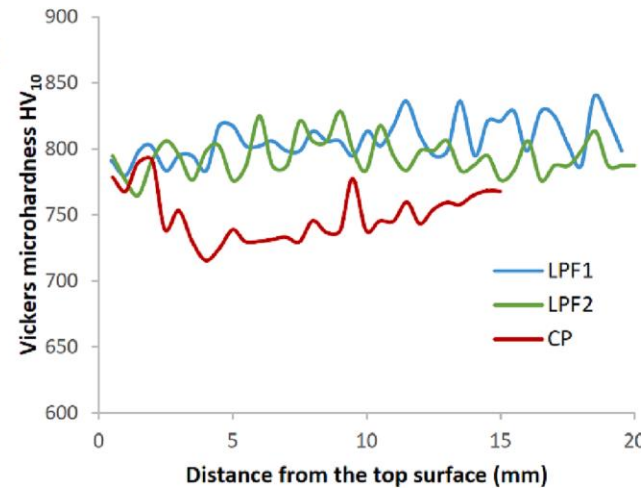
..... Vickers measurements

Laser Power Function LPF

CP  
 Constant  
 power



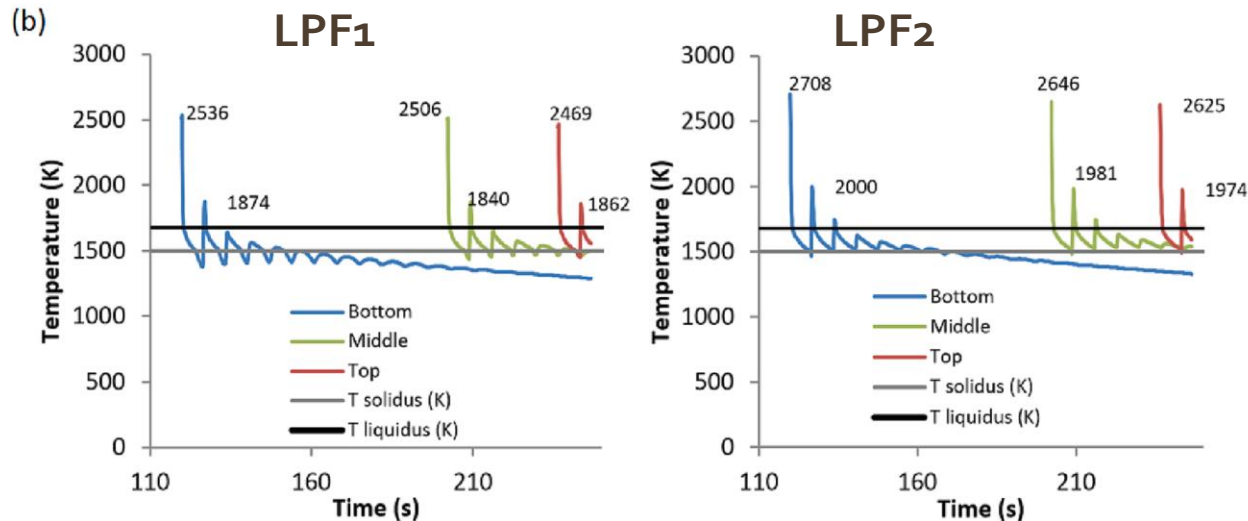
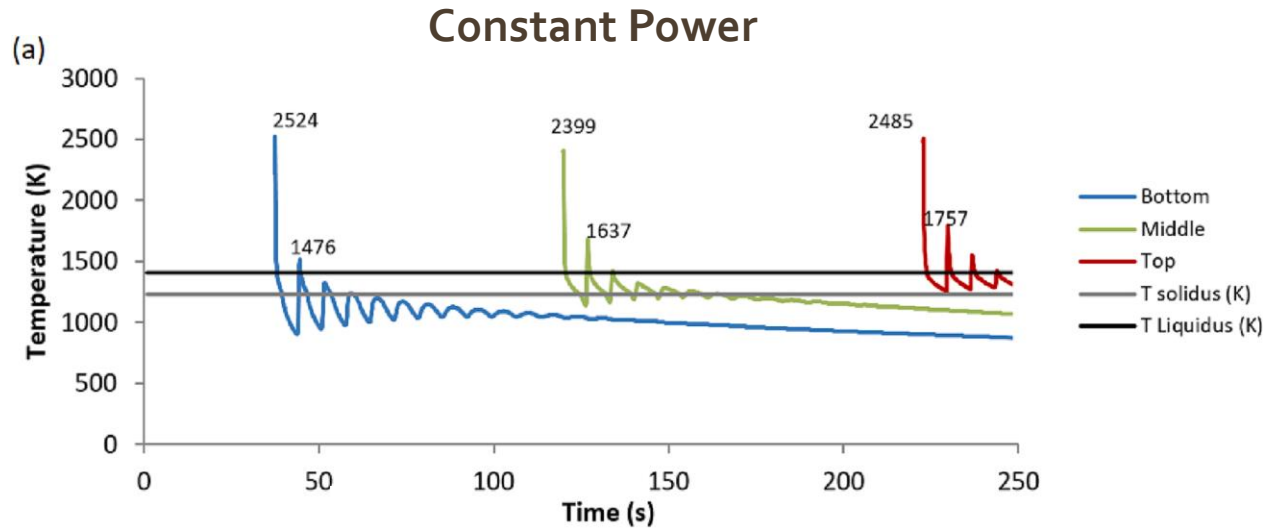
(b)



Average values of Vickers microhardness of DED M4 steel	
Laser Power Function	HV <sub>10</sub>
Constant	748 ± 19
LPF1	803 ± 15
LPF2	791 ± 14



# Tp history analysis



## LPF<sub>2</sub>

Higher homogeneity  
Higher in situ annealing T<sub>p</sub><sup>o</sup>

Average max peak T<sub>p</sub><sup>o</sup>

LPF<sub>2</sub> : 2569 K

LPF<sub>1</sub>: 2505 K

CP : 2469 K

Higher accumulation of heat

→ slower cooling process

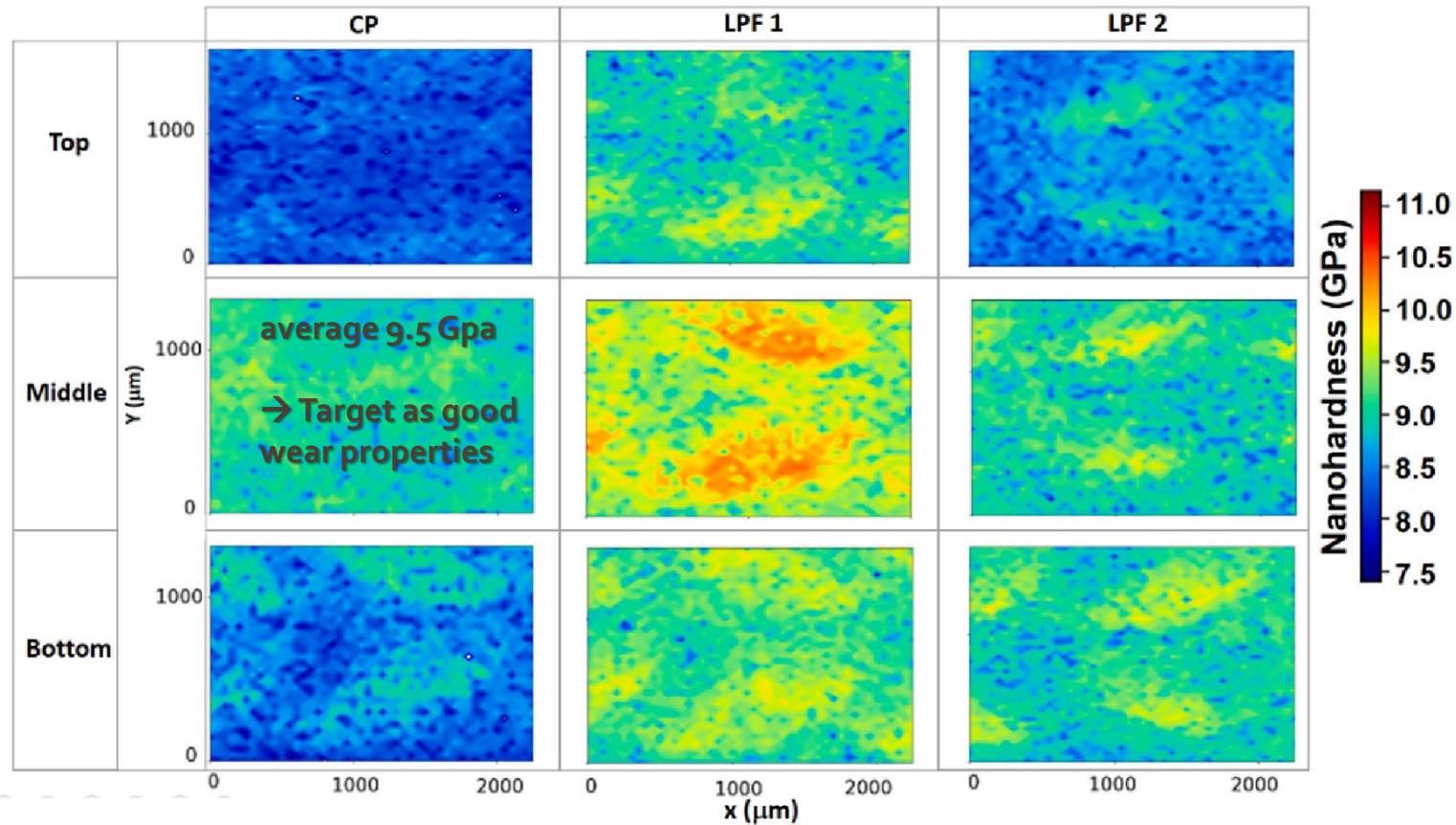
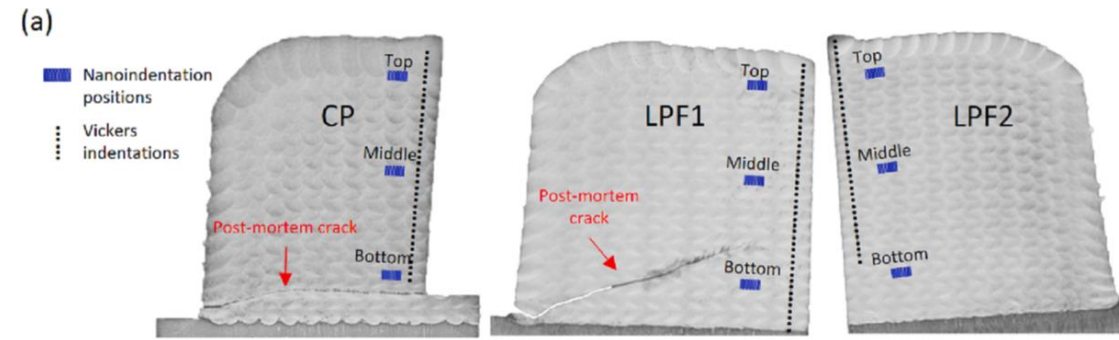
→ more homogenous microstructure

→ lower residual stresses

→ No crack in LPF<sub>2</sub> sample at cutting.

Jardin Optic & Laser technology 2023

# Nano indentation maps Confirm homogeneity

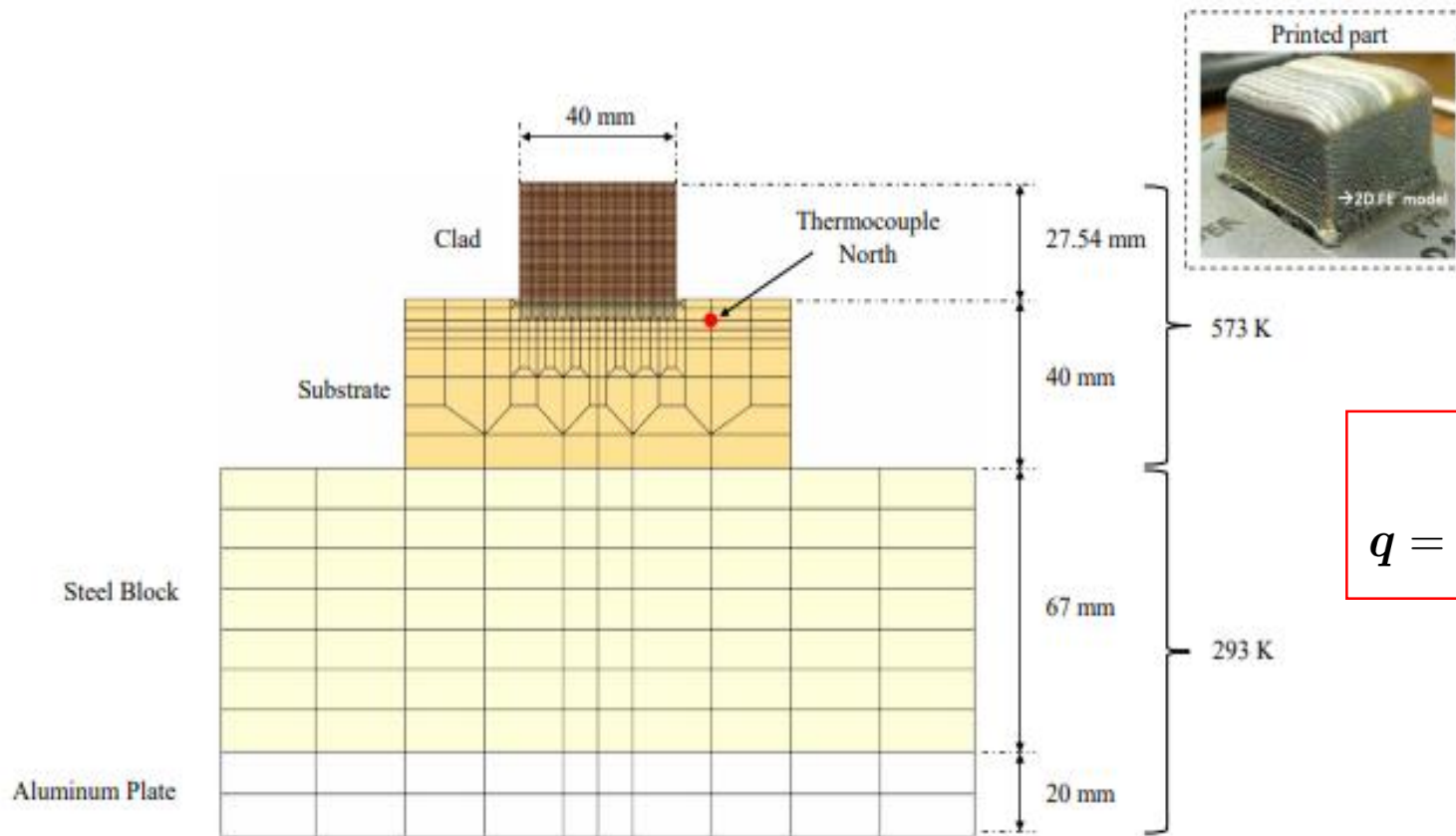


Homogeneity  
of LPF2  
confirmed  
+  
Interest level of  
hardness  
reached  
  
= optimum

For prediction heterogeneity:  
melt pool events  
→ CFD needed

## 2<sup>nd</sup> METHOD

# Feed Forward Neural Network (FFNN) replaces FE



Input  $\mathbf{q}$

Output  $T$

$$T = T(\mathbf{q}),$$
$$\mathbf{q} = [x, y, z, t, m_1, \dots, m_\mu, p_1, \dots, p_\nu]$$

Position,  
Time

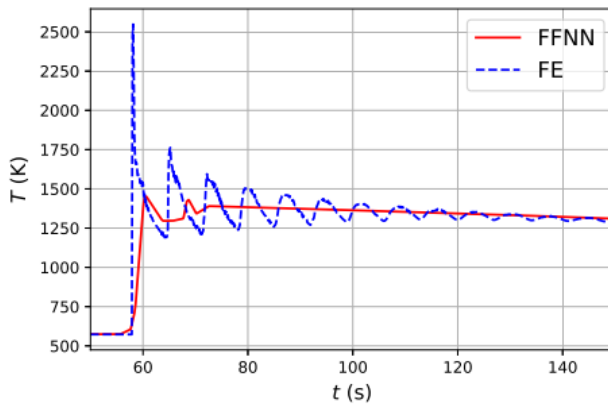
Material  
properties

Process  
parameters

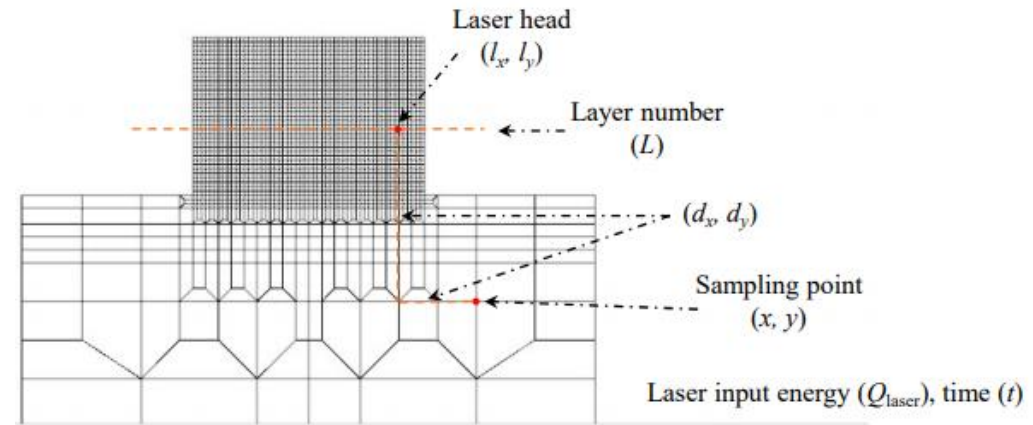
T.Q.D Pham *Journal of Intelligent Manufacturing* 2022

# Feature selection $q$ in the FFNN

Using only the  $(x, y, t, Q_{\text{laser}})$

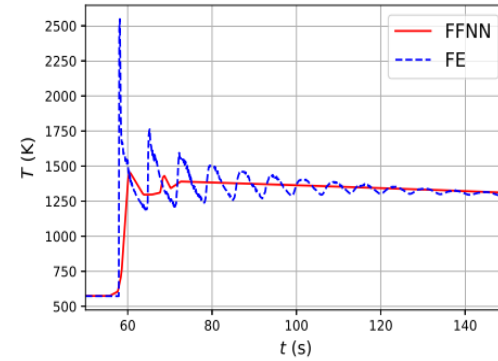
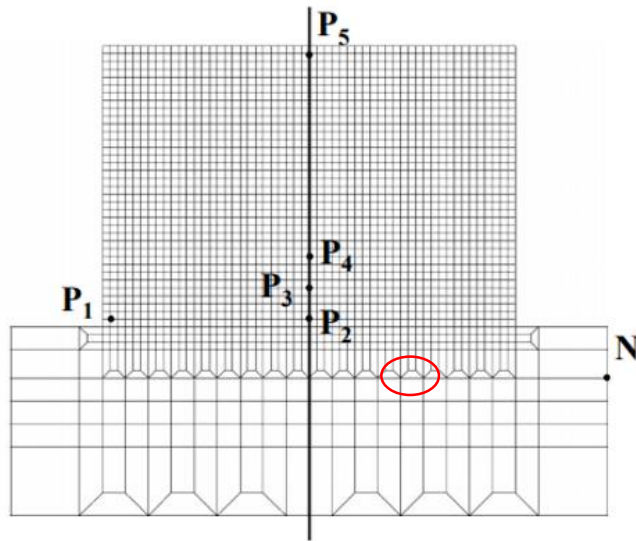


**Integrate physics**

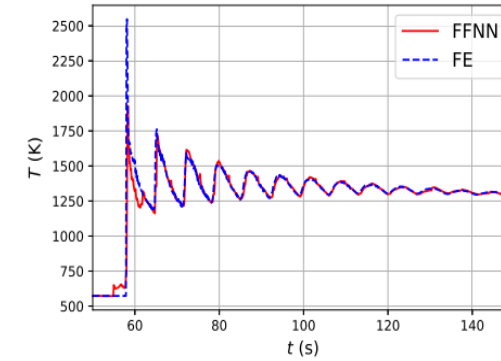


Model	Base model (BM)	Intermediate model (IM)	Full model (FM)
Input features	$x, y, t, Q_{\text{laser}}$	$x, y, t, l_x, l_y, Q_{\text{laser}}$	$x, y, t, l_x, l_y, d_x, d_y, L, Q_{\text{laser}}$
Number of input features	4	6	9
$R^2$	0.798	0.968	0.994

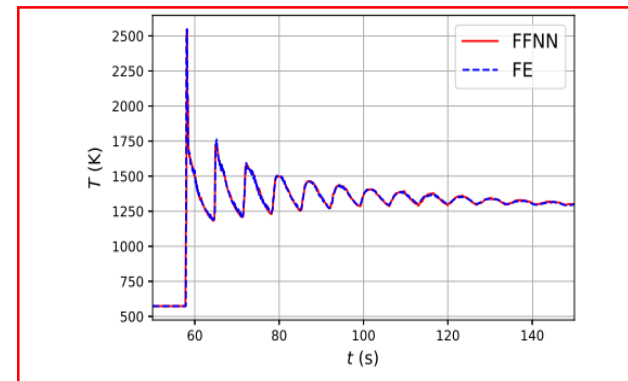
# FFNN Result analysis $T_p^\circ$ at Point 2



Base model (4)



Intermediate model (6)



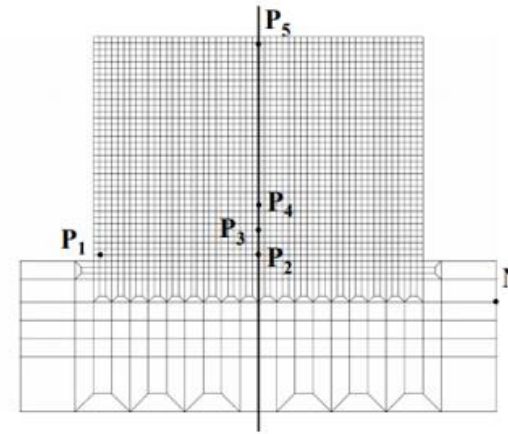
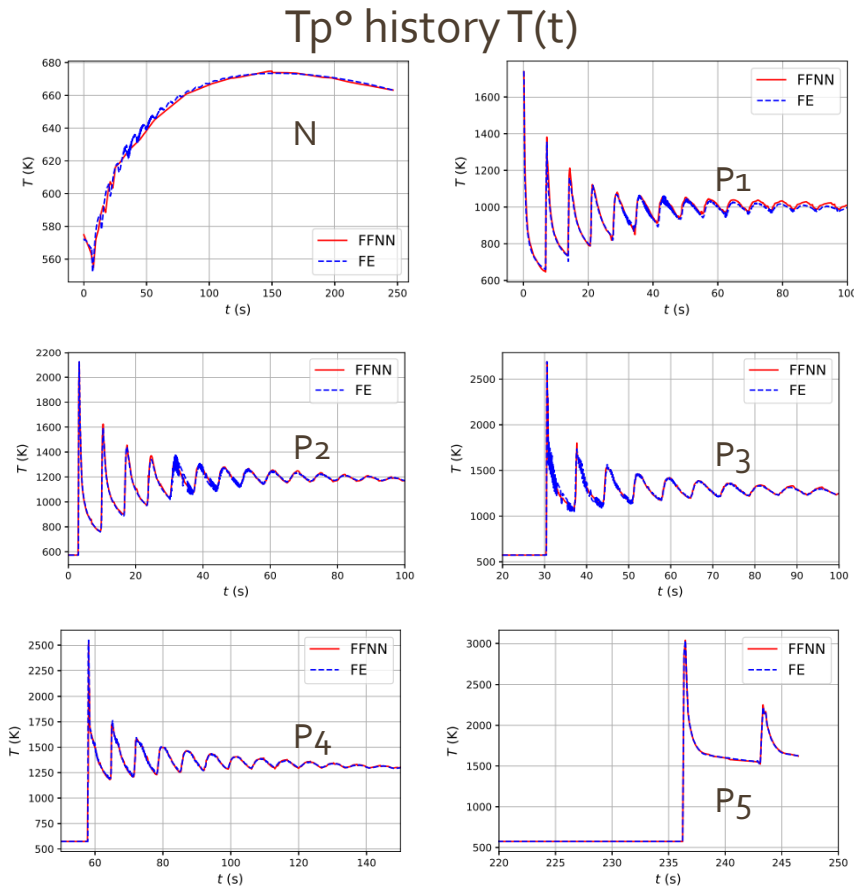
Full model (9)



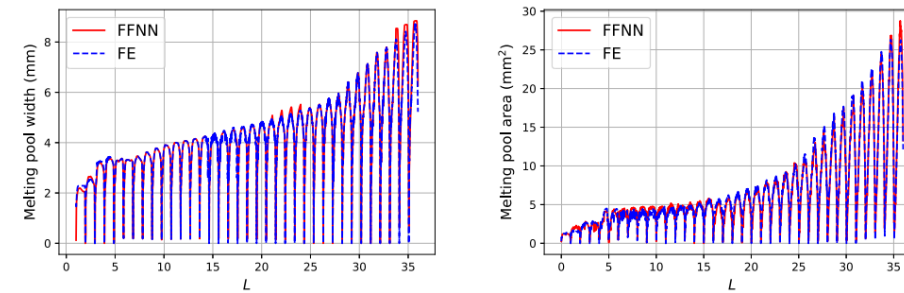
Integrating physics to the DL model to capture cycles and peaks



# FFNN Result analysis $T_p^\circ$ + Melt pool size



## Melting pool sizes



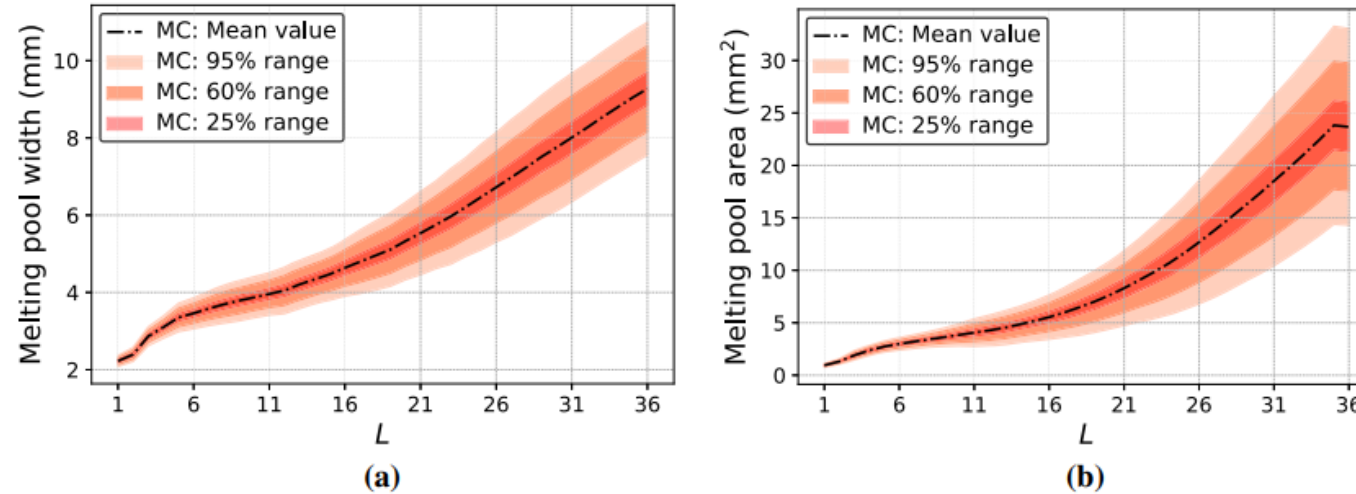
Melt pool width

Melt pool area

For each layer

# FFNN Result analysis

Extreme sensitivity of the melt pool to the uncertainty of  $Q_{laser}$



## Computational cost

	Running FE simulations for creating training dataset	Training time	Single temperature field evaluation	1000 temperature fields evaluation
FE (h)	2.4	-	35 → 25 min	600
FFNN (h)	-	0.5	0.0033 (or 12 s)	3.3

Please do not tell

-use good parallel code

-use better PC

....

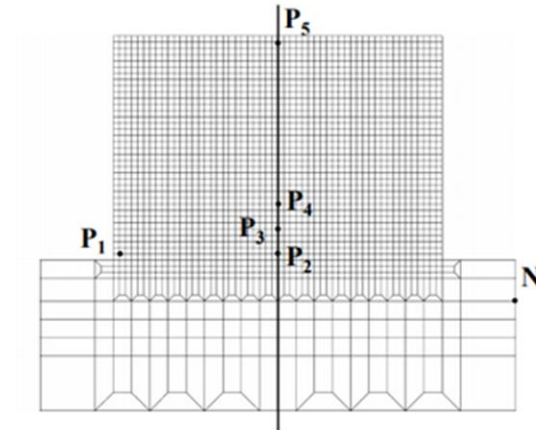
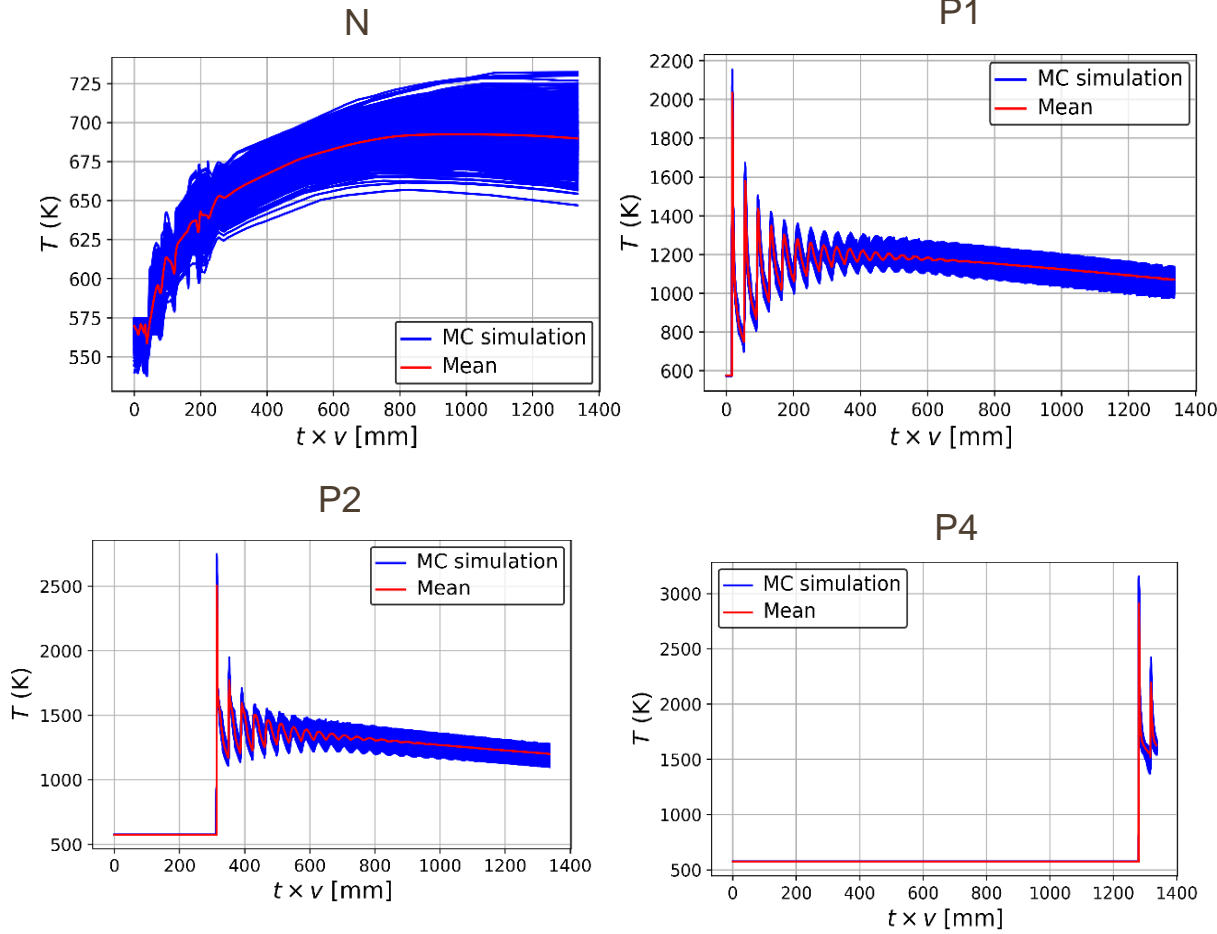
Just observe in same conditions the CPU reduction

# Parameter uncertainty based on literature review & domain knowledge

Input uncertain parameter		Notation	Reference	Minimum value	Maximum value	Distribution type	Unit
Process parameters	Effective laser power	$\mathcal{P}$	1	0.97	1.03	Uniform	-
	Scanning speed	$v$	350	335	365	Uniform	mm/min
	Controllable ambient temperature	$T_a$	298.15	284.15	312.15	Uniform	K
	Substrate preheating temperature	$T_s$	573.15	555.15	591.15	Uniform	K
Material properties	Convection	$h$	250	200	300	Uniform	W/m <sup>2</sup> K
	Radiation	$\varepsilon$	1	0.8	1	Uniform	-
Environmental conditions	Thermal conductivity	$\alpha_k$	1	0.93	1.07	Uniform	-
	Heat capacity	$\alpha_c$	1	0.95	1.05	Uniform	-

# Propagation of uncertainty on $T_p^\circ$

Monte Carlo simulations to explore the space

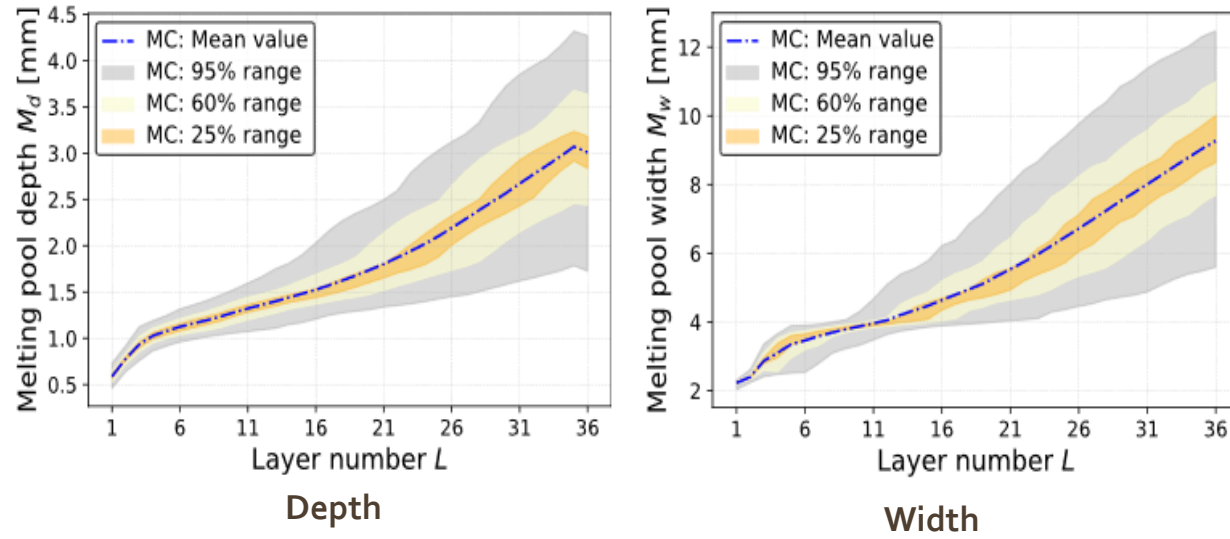


→ details in:

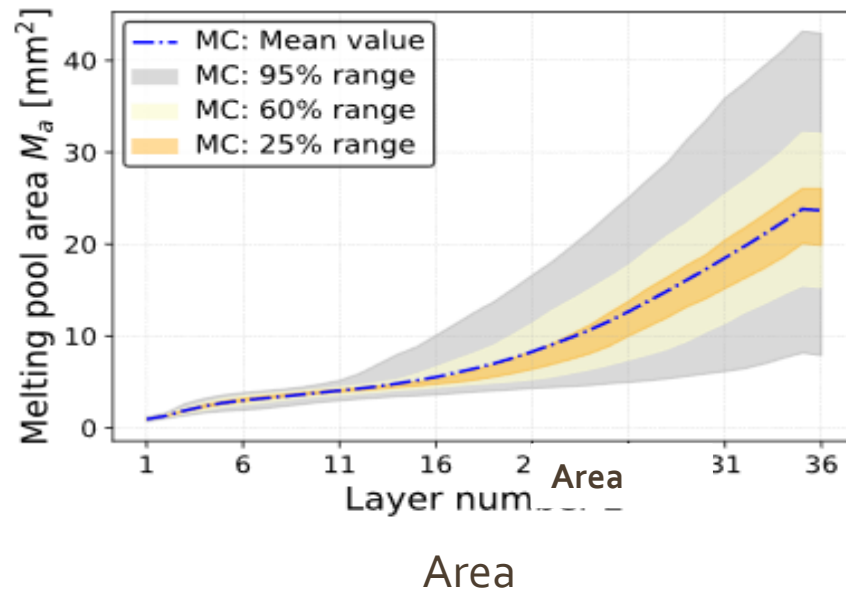
*Characterization, propagation, and sensitivity analysis of uncertainties in the DED process using a DL surrogate model*

Thinh Quy Duc Pham, et al. *Probabilistic-Engineering-Mechanics*, 2022

# Uncertainty on melt pool size + CPU time



→ Steady melting pool during DED process... a challenge !  
 Need optimal laser power + minimum uncertainty



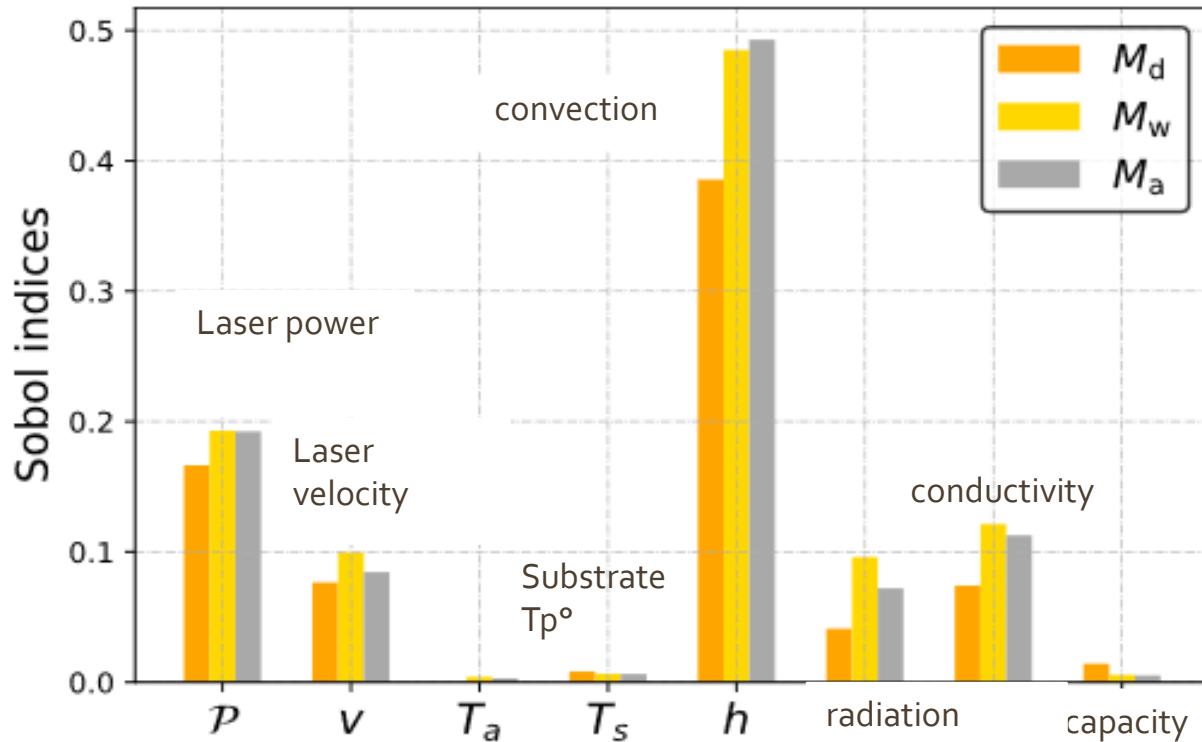
Computational costs needed to perform a direct MC simulation, using the FE and FFNN-based surrogate model

Number of MC simulations	FE model (h)	FFNN-based surrogate model (h)
1	0.6	0.0033 (12 s)
1000	600	3.3

T.Q.D Pham Probabilistic-Engineering-Mechanics 2022



# Conclusions about uncertainty study

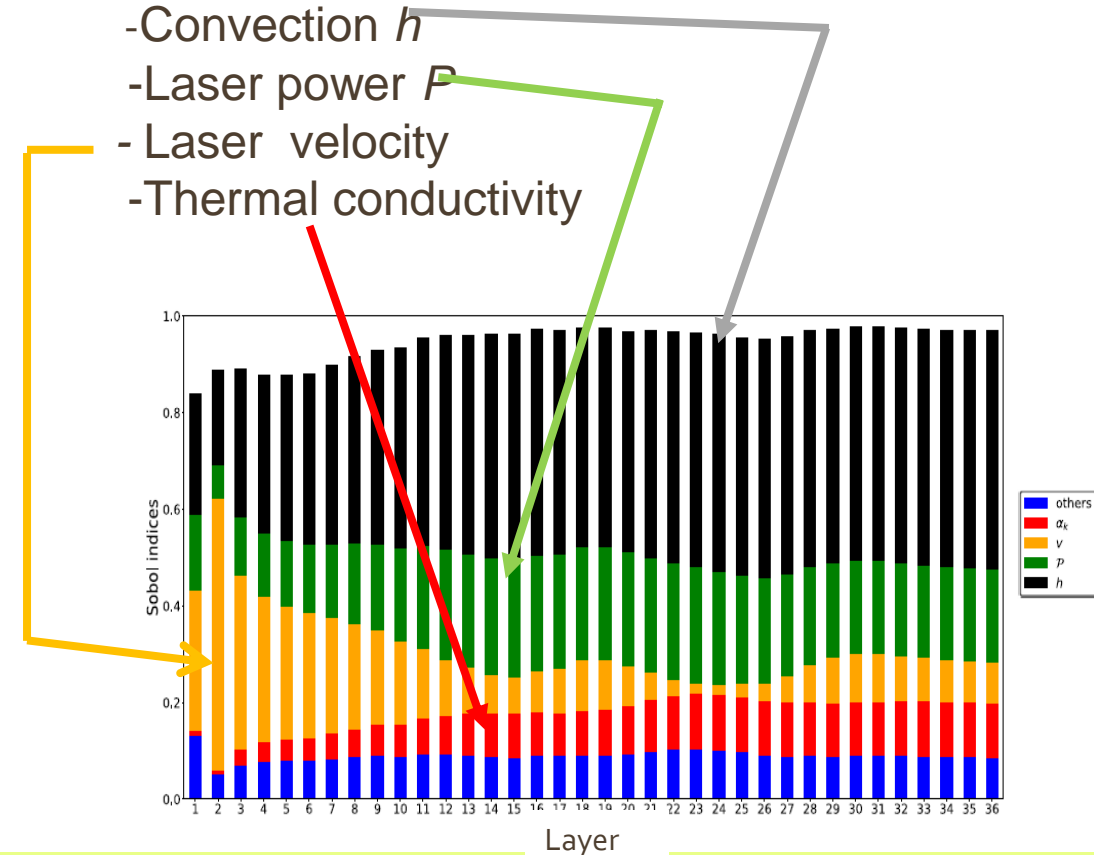


Need of stable input material properties & boundary conditions in industry

Material values input in model have a high impact

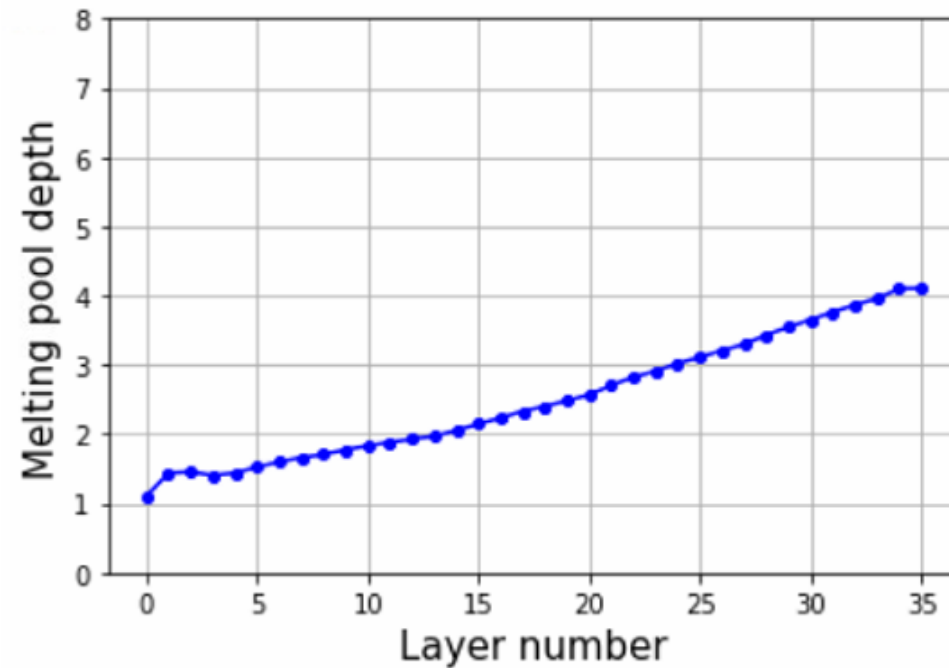
T.Q.D Pham Probabilistic-Engineering-Mechanics 2022

Melt pool size  $M_d M_w M_a$   
 → Microstructure  
 → Product properties  
 Mostly modified due to Uncertainties on  
 - Convection  $h$   
 - Laser power  $P$   
 - Laser velocity  
 - Thermal conductivity



Remind: constant laser power  
→ non constant Melt pool depth

Const power  
 $P = 1100 \text{ W}$



⇒ Need to consider the laser power varying with layer number

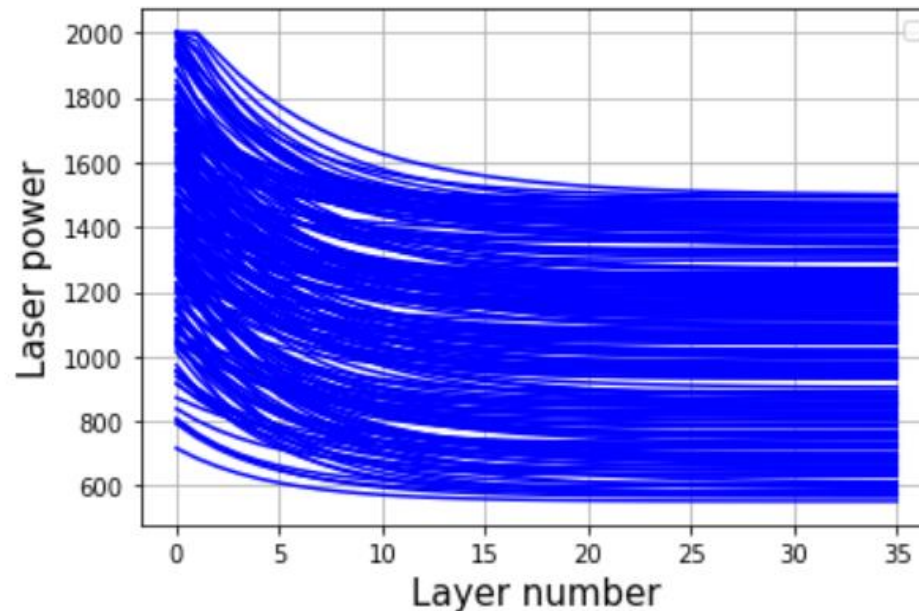
⇒ More homogeneous melt pool and microstructure

# Laser power varying with layer number

Choice of a function  $f(x) = a \times e^{-kx} + b$

$$a \in [200,800], b \in [550,1500], k \in [0.15,0.25]$$

Its coefficients  
a, b, k  
also called  
 $\alpha_1 \alpha_2 \alpha_3$   
= the unknowns



If laser power value  $< 578$  W, there will be no melting pool  
since the  $tp^\circ$  is smaller than the melting temperature  
 $\rightarrow$  Space not explored

# Optimal P(layers) under Minimal Energy

Objective function (step 5) :

Mean  $\mu_q$   
& Standard deviation  $\sigma_q$   
of the difference  
(computed melt pool size-user  
defined value)  
+  
Process Energy

(w weight and  $\zeta$  scale factors)

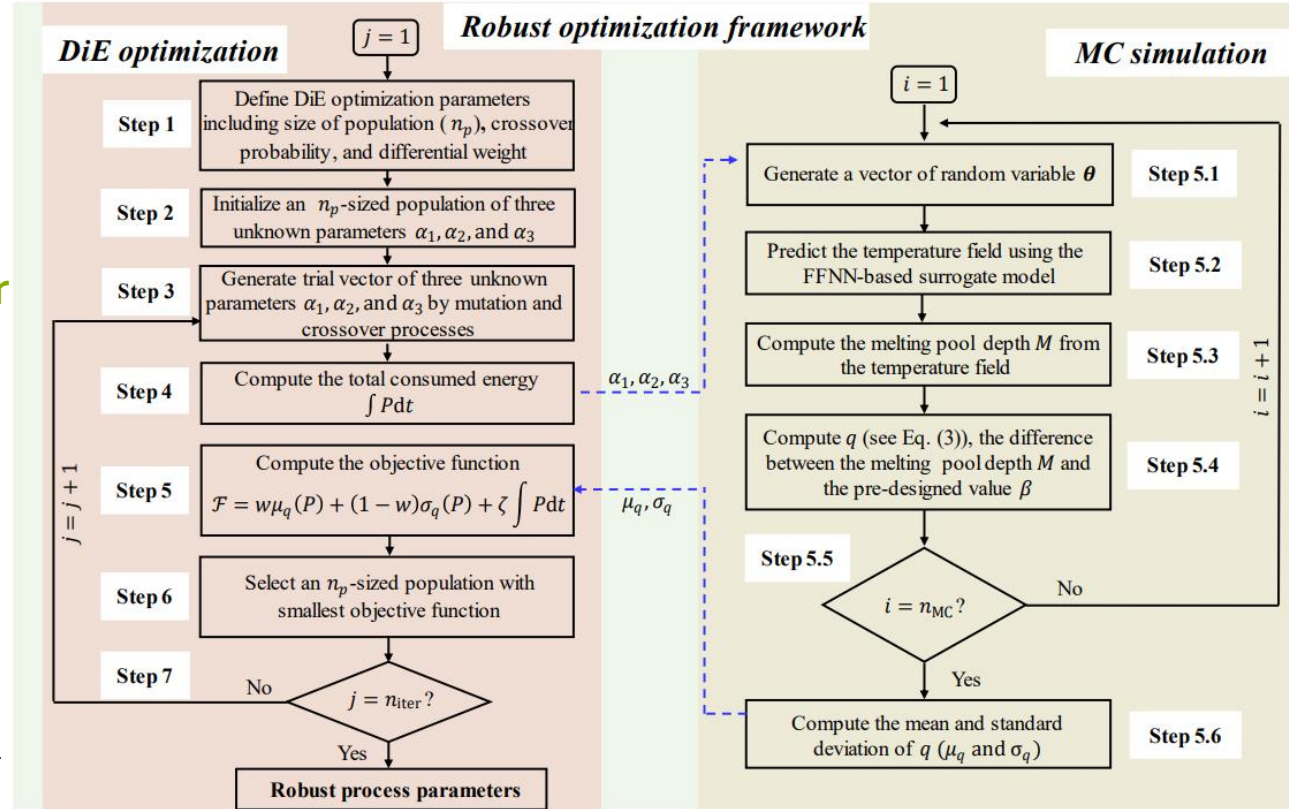
DiE:

Price KV. *Differential evolution, intelligent systems reference library* 2013.

& Frame inspiration:

Bilal M Eng Appl Artif Intel 2020

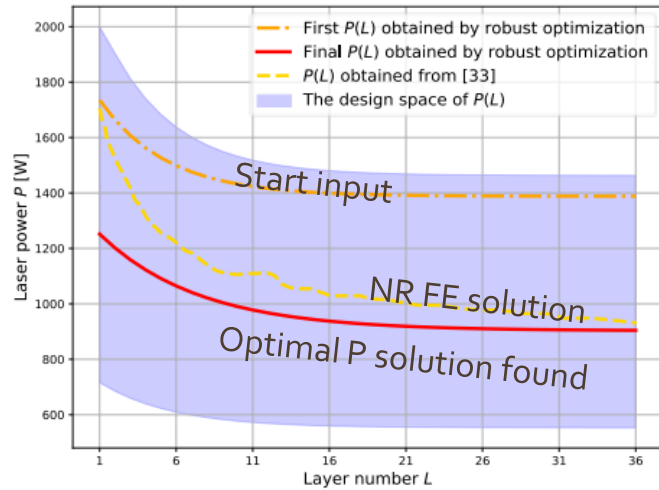
Opara Evol Comput 2019



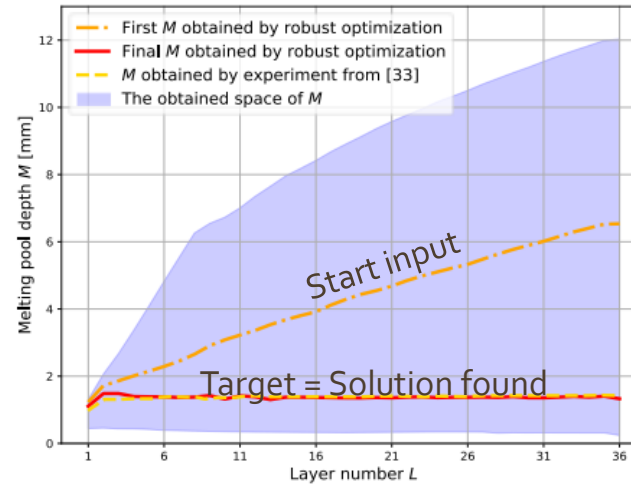
Differential Evolution (DiE)  
Monte Carlo Simulations (MC)

T.Q.D Pham *Journal of Manufacturing Processes* 2023

# Robust Results



Power Laser function versus layers



Melt pool depth versus layers

$$f(x) = a \times e^{-kx} + b$$

$$a \in [200,800], b \in [550,1500], \\ k \in [0.15,0.25]$$

→ Found:

$$a = 407.1,$$

$$b = 910.16, k = 0.1498$$

**FE solution: Newton Raphson optimization without energy constraint**

*Jardin Optic & Laser technology 2023*

**DL solution: Robust optimization - uncertainty & energy constraint added**

*T.Q.D Pham Journal of Manufacturing Processes 2023*



# Contents

- ✓ A survey of scales and methods
- Finite element method FEM
  - ✓ one element: Solid Shell
  - ✓ mechanical constitutive laws (multi scale ?)
    - ✓ Deep Drawing
  - ✓ thermo-mechanical analysis
    - ✓ Cooling of rolling mills
    - ✓ Continuous casting
- ✓ Representative Volume Element (RVE) or in French VER
- ✓ Coupling solid FEM with ... Computational Fluid Dynamics, Deep Learning
  - ✓ Additive Manufacturing

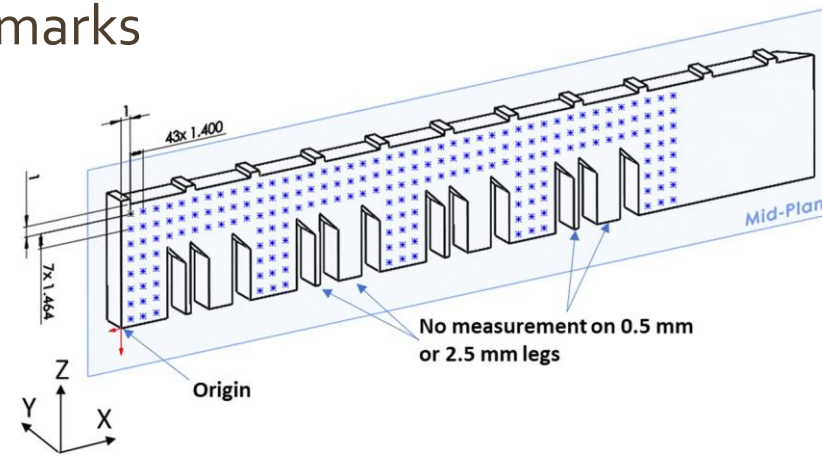
If interest in the last examples  
R. Jardin  
*PhD defense March 24*  
T.Q.D. Pham  
*PhD defense April 24*

TO END ... Selection of infos and PhDs giving interesting ideas for AM

# Models evolve! Check benchmarks and data provided

- <https://www.nist.gov/ambench/types-benchmarks>

Yang, Y., Allen, M., London, T. *et al.* Residual Strain Predictions for a Powder Bed Fusion Inconel 625 Single Cantilever Part. *Integr Mater Manuf Innov* **8**, 294–304 (2019).  
<https://doi.org/10.1007/s40192-019-00144-5>



- Airbus, Apworks, Siemens ... have reliable eigen strain method to design their pieces
- I. Setien, M. Chiumenti, S. van der Veen, M. San Sebastian, F. Garcíandía and A. Echeverría,  
Empirical methodology to determine inherent strains in additive manufacturing, *Computers and Mathematics with Applications*, (2018)

# Principle of inherent (eigen) strain method

- Identify a strain field
- Compute the associate stress field (elastic or an elastoplastic model) to recover internal stress field able to generate the part distortion

In industry calibration is done by experiments :  
cut in a simple AM part (cube) and measure displacement  
If your cube is representative OK ....

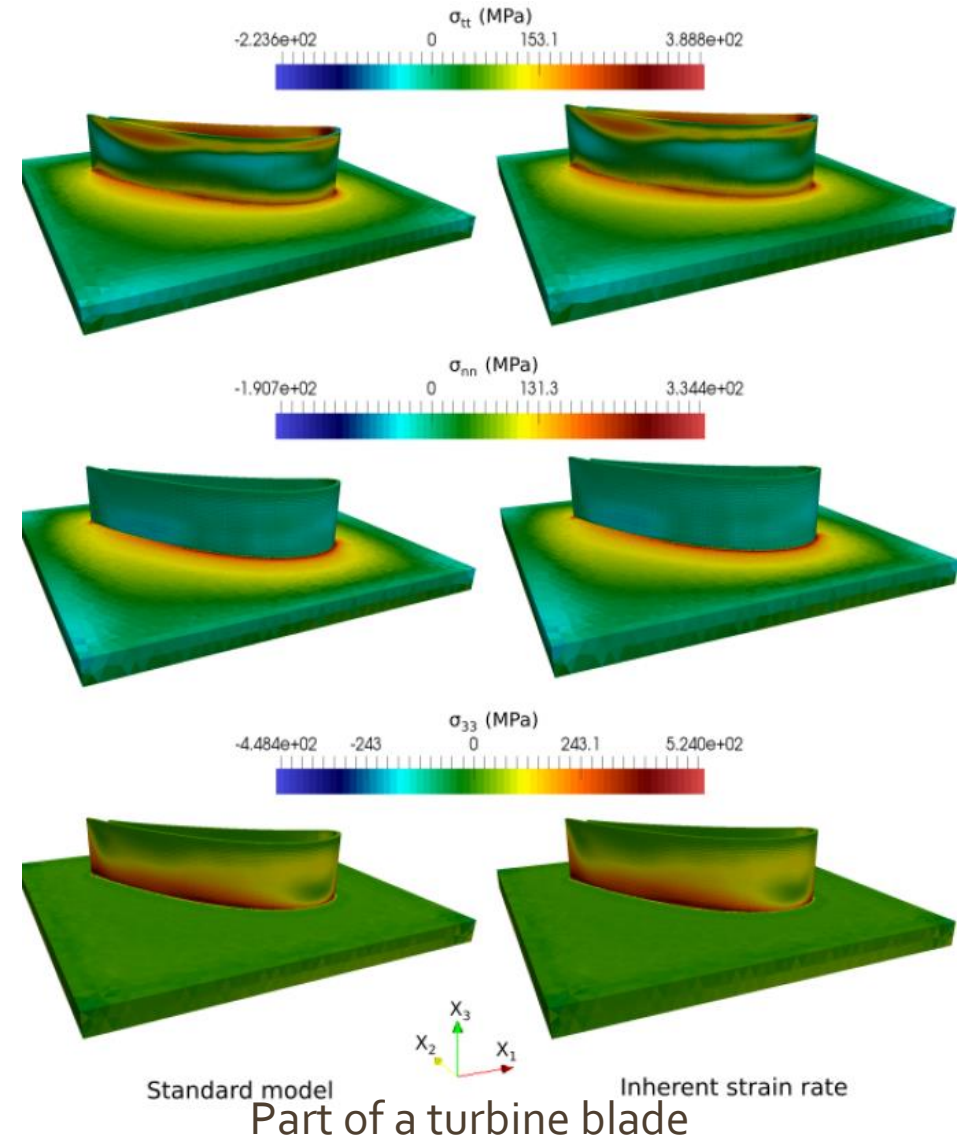
What if large complex shape...

*OK for distortion however customers not happy: calibration is time consuming.  
Your specific case, not always in the data base (related to LPBF and TA6V, 316L, Incoloy.....)*

*Nothing invented... methodology already use by Eshelby 1957 Proceedings of the Royal Society of London Series A –Mathematical and Physical Sciences 241 (1226), 376–396.*

# PhD Keumo Tematio DED 316L Thick curve wall - CEMEF 2023

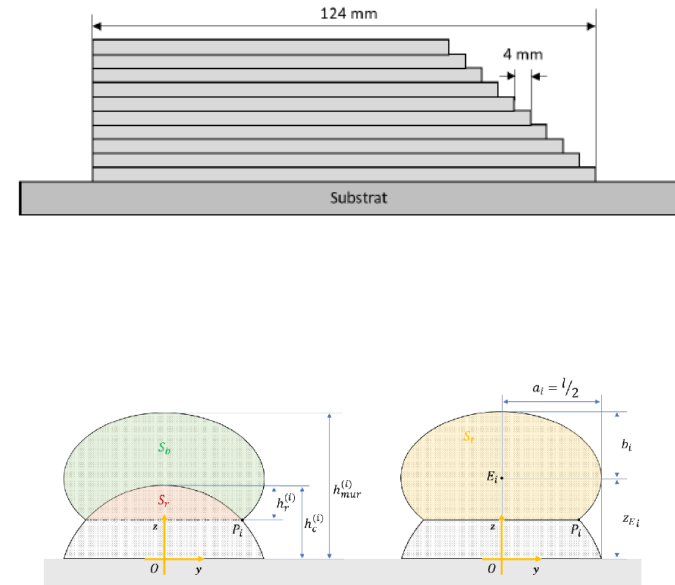
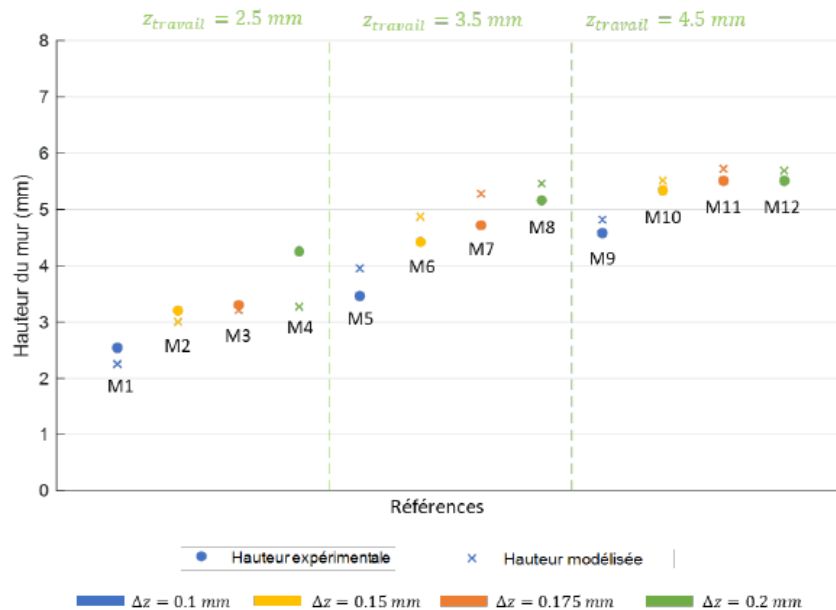
- Theoretical approach applying the large strain formalism to the monitoring of Inactive/Active thermal and mechanical elements and their interface to control the mesh distortion
- The inherent strain fields can be:
  - **computed on the first layers** and exploited on the last layers : OK for linear thin wall but not for curvilinear ones
  - **computed on the whole simulation**, it gave better results ...but rely on a total simulation that we want to avoid...
  - **computed based on the plastic strain rate close to the laser**: OK for curvilinear wall but requires also a total model of the laser path (larger steps) but still long CPU (reduction factor 5)



# PhD Leroy Dubief - DED 316L - Université de Bordeaux 2023

- **Analytic** model providing the **shape of the clad** for different process parameters

(initial working distance and z-increment) & position within the wall, good accuracy



Many physical ingredients and experimental validations  
Code shared in Annex.



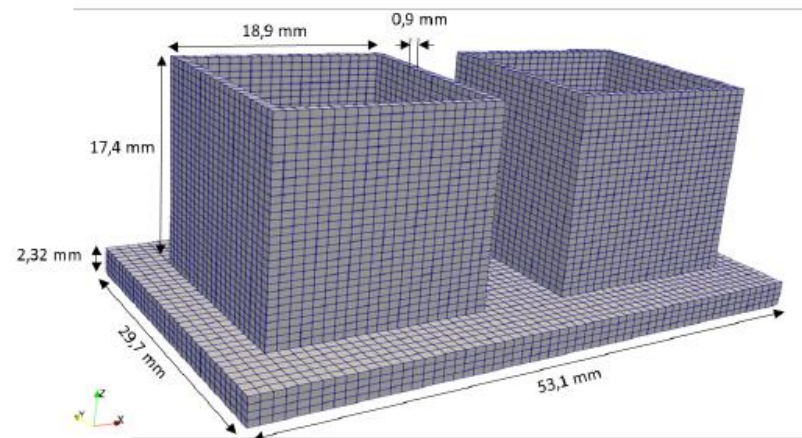
## FE coupled with a proper orthogonal decomposition (POD)

It exploits the thermal behavior induced by the repetitive nature of the process.

POD = thermal field expressed as a linear addition of thermal modes

A specific enrichment of the POD is linked to the FE results

Code able to model 'complex' manufacturing



Experimental validation  
However still simple FE model  
(constant properties)

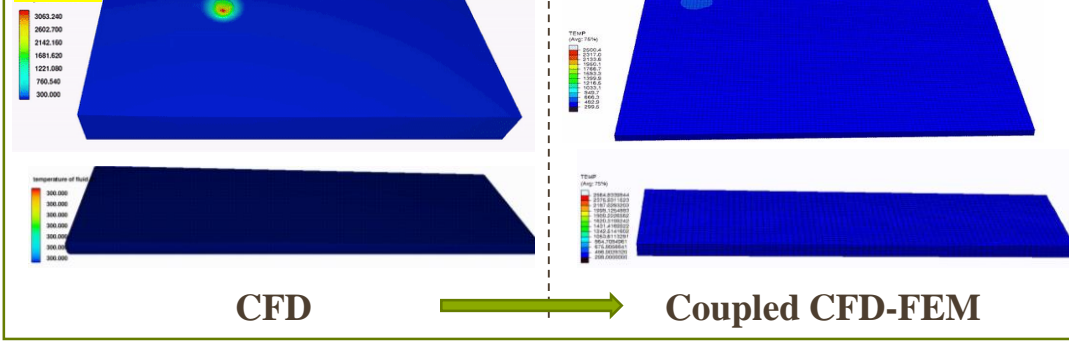
## High-fidelity thermal-fluid flow model



## Coupled CFD-FEM simulation



## DED

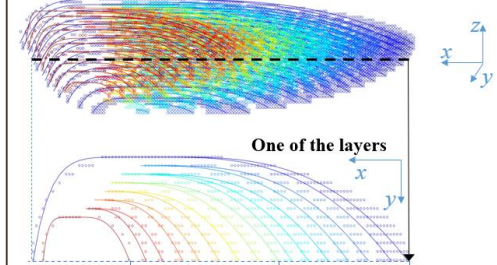


CFD

Coupled CFD-FEM

## Data-driven temperature field prediction

Temperature field at the core region

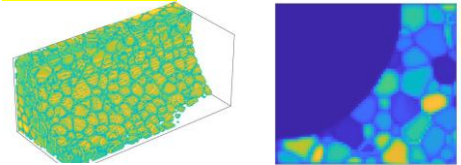


One of the layers  
 $T(N_T) \dots T(n_T) \dots T(1)$   
 1560 K ... 1000 K  
 $N_T$  temperature contours

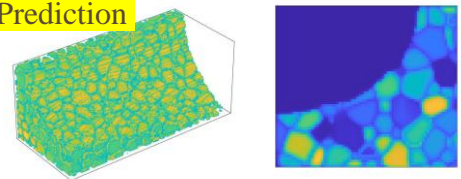
No. 31~40 (10 training samples)

No. 31~40 (10 training samples)

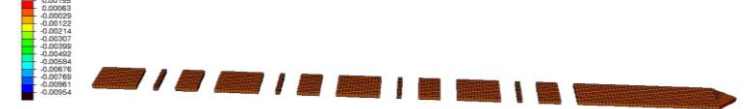
## Ground truth



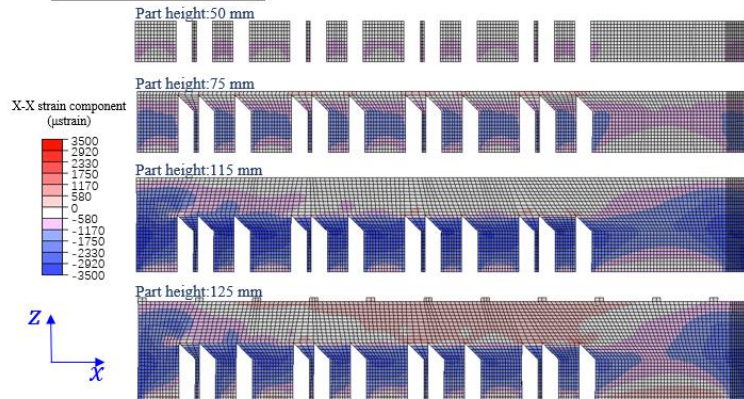
## Prediction



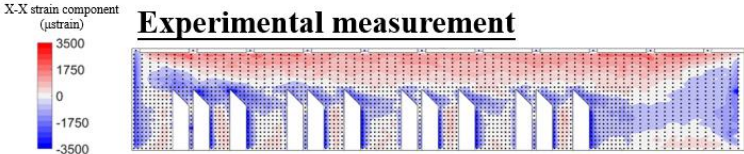
## Up-scale modeling



## Strain mapping



## Experimental measurement



Accurate inherent strain pattern + Neutralization

Post doc scientist  
currently in

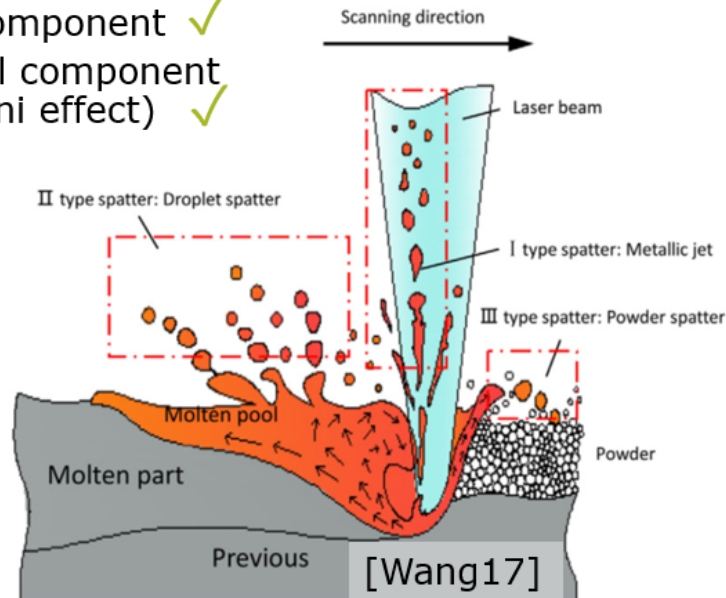


## Particle Finite Element Method = Classic FEM + Particle behavior

- Relatively young method , 1<sup>st</sup> publication by Idelsohn et al. 2004
- Review paper by Cremonesi et al. 2020, 1<sup>st</sup> PhD in Uliege Marco Lucio Cerquaglia

- Fluid dynamics ✓
- Solid mechanics ✓
  - Elastic ✓ +....
  - Elasto-visco-plastic
- Powder model
  - Continuum powder
  - Solid spheres
- Heat transfer ✓
- Heat source model
  - Laser beam
    - Volume heat source ✓✓
    - Surface heat flux ✓✓
    - Ray tracing
  - Electron beam
  - Electric arc
  - etc.
- Phase transition
  - solid↔fluid ✓
  - fluid↔gas
    - Recoil pressure
    - Evaporative cooling
- Surface tension
  - Normal component ✓
  - Tangential component (Marangoni effect) ✓
- Thermal expansion ✓

Don't forget:  
2D → 3D



Constant remeshing  
Liquid boundary surface identified  
Phase change efficient  
Constitutive law unified between solid and liquid

...

Still work to do but close to AM now





Merci de votre attention

Bon choix d'échelles, de couplages, de modèles

Si questions, n'hésitez pas

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