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Massively parallel multiphase simulation of the impingement and solidification of multiple submicrometer droplets in suspension plasma spraying process

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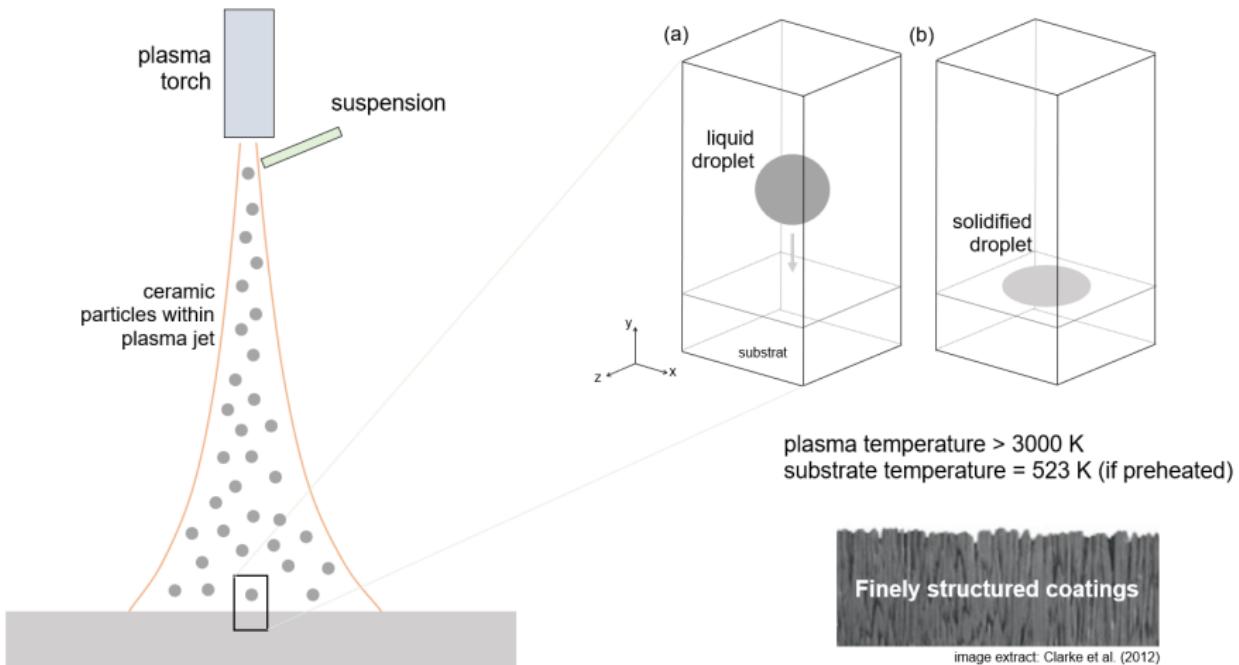
# Massively parallel multiphase simulation of the impingement and solidification of multiple submicrometer droplets in suspension plasma spraying process

- ① Research context
- ② Physical model & numerical methods
- ③ Validation test cases
- ④ Single droplet impact
- ⑤ Multiple droplet impact
- ⑥ Conclusion

The doctoral research hereby presented takes part of the **AVENTURINE** project of the French Nouvelle-Aquitaine region in partnership with



## Droplet impact and solidification in suspension plasma spraying



## Multiphase compressible model with liquid-solid phase change

Compressible ideal gas and incompressible liquid

$$\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho \mathbf{u}) = 0 \quad (1)$$

$$\rho \left( \frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} \right) + C \frac{f_s^2}{(1 - f_s)^3 + b} \mathbf{u} = -\nabla p + \nabla \cdot \boldsymbol{\tau} + \sigma \kappa \nabla f_d \quad (2)$$

$$\frac{dp}{dt} = -\rho c^2 \nabla \cdot \mathbf{u} + \frac{\beta_p \rho c^2}{\rho c_p^*} \left( \nabla \cdot (\lambda \nabla T) + \rho L \frac{\partial f_s}{\partial t} \right) \quad (3)$$

$$\frac{\partial H}{\partial t} + \nabla \cdot (\mathbf{u} H_f) = \frac{dp}{dt} + \nabla \cdot (\lambda \nabla T) \quad (4)$$

$$\frac{\partial f_\ell}{\partial t} + \mathbf{u} \cdot \nabla f_\ell = 0 \quad (5)$$

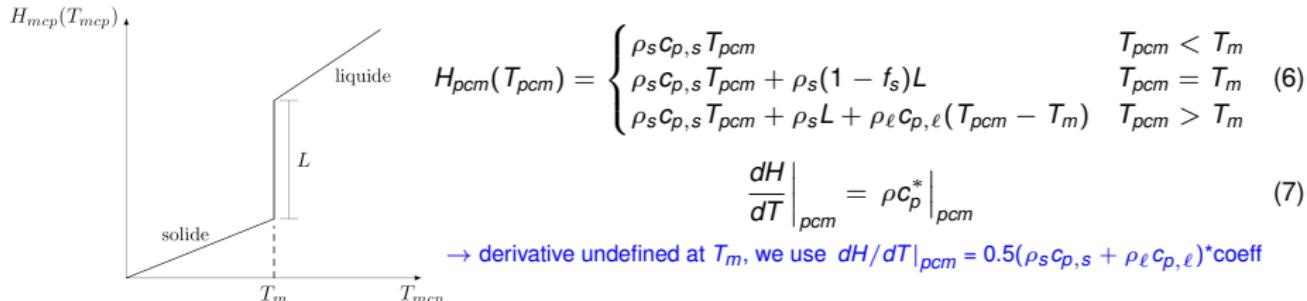
where subscripts  $d$  = droplet,  $\ell$  = liquid,  $s$  = solid,  $f$  = fluids

- Carman-Kozeny for solid PCM ; CSF model for surface tension ; MOF or conservative VOF
- ⓐ linearized enthalpy method for the liquid-solid phase change
- ⓑ incremental pressure correction method for compressible flows ( $\phi = p^{n+1} - p^n$ )
- no contact angle imposed (high We, immediate solidification at contact), no turbulence considered

# Physical model & numerical methods

## ⓐ Linearized enthalpy method

Pure PCM: isothermal liquid-solid phase change model in terms of volumetric enthalpy ( $H = \rho h$ )



→ derivative undefined at  $T_m$ , we use  $dH/dT|_{pcm} = 0.5(\rho_s c_{p,s} + \rho_\ell c_{p,\ell}) * \text{coeff}$

note :  $dH/dT$  equal to  $\rho c_p$  for incompressible & ideal gas

**The idea:** linearization of the enthalpy-temperature relation by first order Taylor expansion around a previously known value of the temperature (sub-iteration  $k - 1$ ) – from Kaaks et al., 2022 & other authors

$$H_k^{n+1} = H_{k-1}^{n+1} + \left. \frac{dH}{dT} \right|_{\substack{n+1 \\ k-1}} [T_k^{n+1} - T_{k-1}^{n+1}] \quad (8)$$

→ used to develop the energy equation (4) from enthalpy to temperature form, e.g:

$$\rho c_p^* \left( \frac{T_k^{n+1} - T_{k-1}^{n+1}}{\Delta t} + \mathbf{u} \cdot \nabla T^n \right) = T_k^{n+1} \beta_p \frac{dp^{n+1}}{dt} + \nabla \cdot (\lambda \nabla T_k^{n+1}) + \frac{H^n - H_{k-1}^{n+1}}{\Delta t} \quad (9)$$

# Physical model & numerical methods

## Pressure equation

Considering pressure  $p = p(\rho, T)$

$$dp = \left. \frac{\partial p}{\partial \rho} \right|_T d\rho + \left. \frac{\partial p}{\partial T} \right|_\rho dT \quad (10)$$

using continuity equation, isothermal compressibility and thermal expansion coefficients

$$\frac{dp}{dt} = -\frac{1}{\chi_T} \nabla \cdot \mathbf{u} + \frac{\beta_p}{\chi_T} \frac{dT}{dt} \quad (11)$$

and in conjunction with the energy equation as well the thermodynamic relations

$$\gamma = \frac{(\partial h / \partial T)_p}{(\partial e / \partial T)_v}, \chi_T = \frac{\gamma}{\rho c^2} \text{ and } \frac{T \beta_p^2}{\rho c_v \chi_T} = \gamma - 1 \quad (12)$$

we have the equation

$$\frac{dp}{dt} = -\rho c^2 \nabla \cdot \mathbf{u} + \frac{\beta_p \rho c^2}{\rho c_p^*} \left( \nabla \cdot (\lambda \nabla T) + \rho L \frac{\partial f_s}{\partial t} \right) \quad (13)$$

## ⑤ Incremental pressure correction method

Obtaining a predicted velocity  $\mathbf{u}^*$  from pressure gradient at time  $n$ , e.g.

$$\rho^n \frac{\mathbf{u}^* - \mathbf{u}^n}{\Delta t} = -\nabla p^n + \mathbf{F}^* \quad (14)$$

God's classical approach : difference between equation (14) and momentum equation (2) and neglecting nonlinear and stress tensor divergence

$$\mathbf{u}^{n+1} - \mathbf{u}^* = -k_\phi \nabla \phi \quad (15)$$

$$\phi = p^{n+1} - p^n \quad (16)$$

then applying divergence

$$\nabla \cdot \mathbf{u}^{n+1} - \nabla \cdot \mathbf{u}^* = -\nabla \cdot (k_\phi \nabla \phi) \quad (17)$$

Combining pressure equation (13) and equation (16), we have the **pressure correction equation**

$$\frac{\phi}{\rho c^2 \Delta t} - \nabla \cdot (k_\phi \nabla \phi) = -\nabla \cdot \mathbf{u}^* + S \quad (18)$$

When  $c \rightarrow \infty$  and  $\beta_p = 0$ , equation (17) is reduced to incompressible flow

# Physical model & numerical methods

## Step-by-step

- ① velocity prediction

$$\rho^n \frac{\mathbf{u}^* - \mathbf{u}^n}{\Delta t} = -\nabla p^n + \mathbf{F}^*$$

- ② pressure increment field resolution

$$\frac{\phi}{\rho c^2 \Delta t} - \nabla \cdot (k_\phi \nabla \phi) = -\nabla \cdot \mathbf{u}^* + S$$

- ③ velocity and pressure update

$$\mathbf{u}^{n+1} = \mathbf{u}^* - k_\phi \nabla \phi$$

$$p^{n+1} = p^n + \phi$$

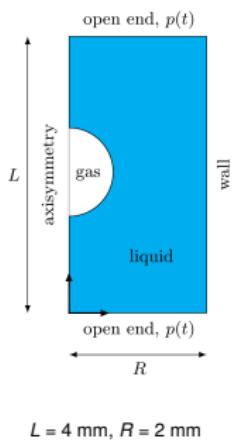
- ④ solve temperature

$$\rho c_p^* \Big|_{k-1}^{n+1} \left( \frac{T_k^{n+1} - T_{k-1}^{n+1}}{\Delta t} + \mathbf{u} \cdot \nabla T^n \right) = T_k^{n+1} \beta_p \frac{dp^{n+1}}{dt} + \nabla \cdot (\lambda \nabla T_k^{n+1}) + \frac{H^n - H_{k-1}^{n+1}}{\Delta t}$$

- ⑤ solve advection (conservative VOF-PLIC method)
- ⑥ update physical parameters through EoS( $T^{n+1}, p^{n+1}$ )

# Validation test cases

## Bubble expansion under variable pressure



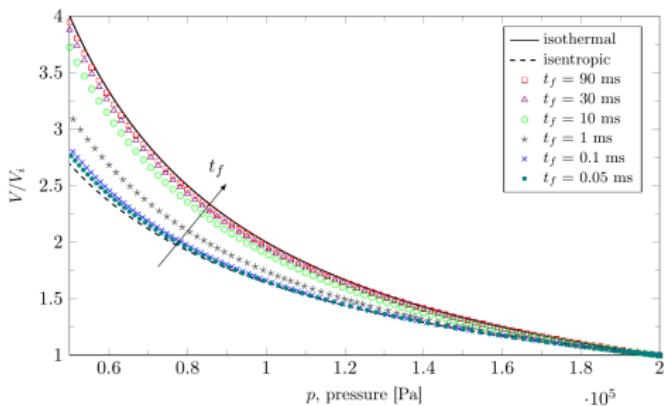
$L = 4 \text{ mm}$ ,  $R = 2 \text{ mm}$

- compressible ideal gas
- incompressible liquid
- $p_0 = 0,2 \text{ MPa}$ ,  $p_f = 0,05 \text{ MPa}$
- pressure variation

$$p(t) = p_0 - \frac{p_0 - p_f}{t_f} \times t$$

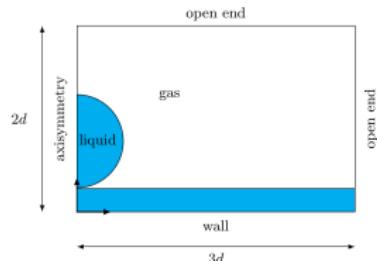
- $t_f = 0,05, 0,1, 1, 10, 30, 90 \text{ ms}$
- $T_0 = 300 \text{ K}$
- $256 \times 512$  mesh
- MOF method
- O2 centered (momentum, energy)
- O2 uncentered (pressure)

→ simulations should give real expansion between ideal isothermal and isentropic curves

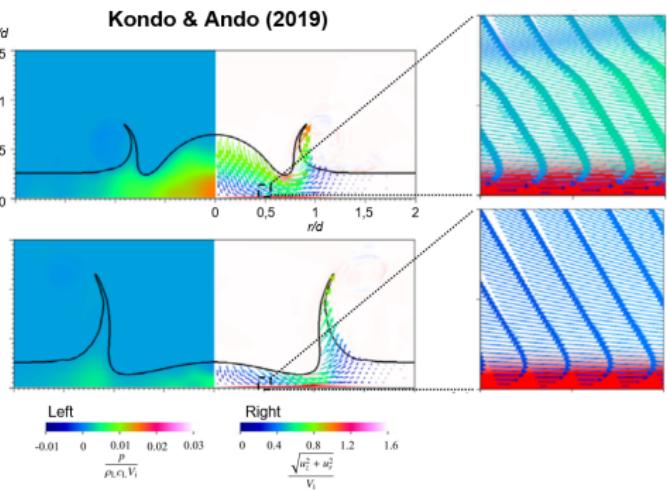
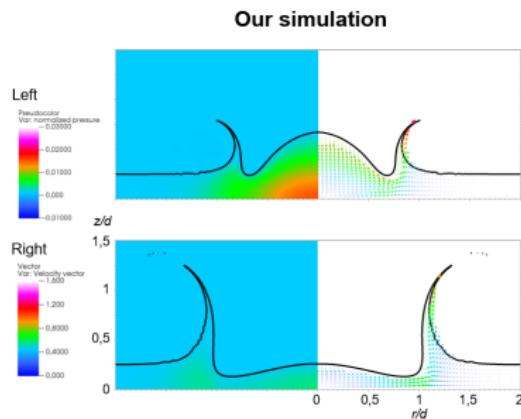


→ larger  $t_f$  tending towards isothermal  
→ lower  $t_f$  tending towards isentropic

## Micrometer droplet impact to liquid film

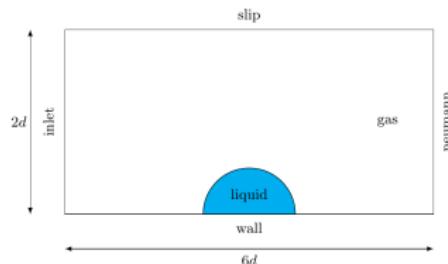


- compressible ideal gas
- weakly compressible liquid considered as stiffened gas
- $d = 200 \mu\text{m}$ ,  $v_d = 50 \text{ m/s}$ ,  $p_o = 101325 \text{ Pa}$
- mesh  $1200 \times 800$ ; MOF method
- O2 centered (momentum) and TVD (pressure) schemes



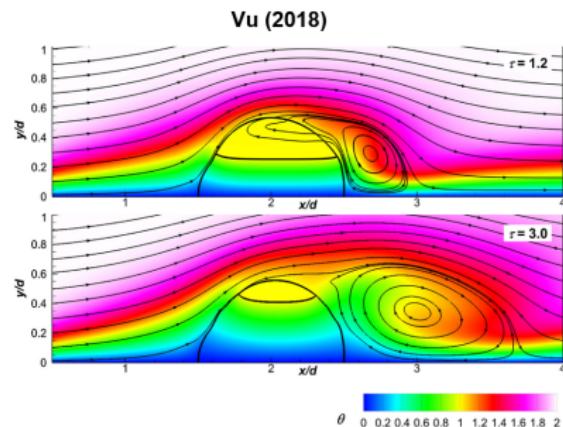
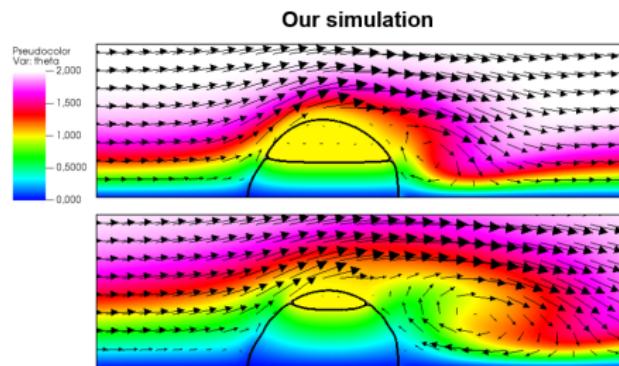
# Validation test cases

## Drop solidification with forced convection



- incompressible case with liquid to solid phase change
- compressible method,  $Re = 400$ ,  $Pr = 0.01$ ,  $St = 0.1$ ,  $Ca = 0.01$
- mesh  $300 \times 100$ ; conservative VOF method
- WENO3 (momentum, energy) and TVD (pressure) schemes

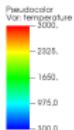
note:  $\rho_s/\rho_\ell = 1.0$  (our case),  $\rho_s/\rho_\ell = 0.9$  (reference)



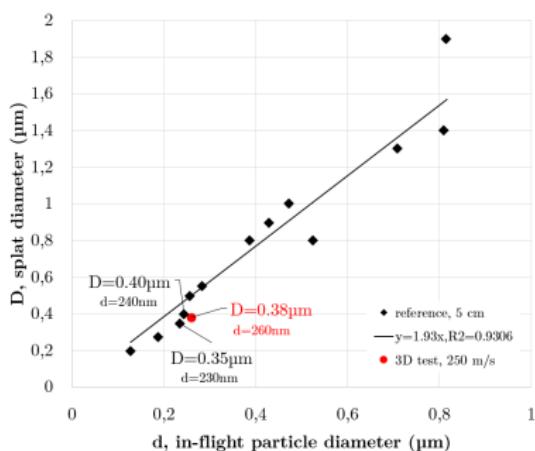
# Single droplet impact

## 3D simulation

- 0.26  $\mu\text{m}$  zirconia droplet,  $\text{Re} = 10.9$ ,  $\text{We} = 185.25$
- considered real experimental conditions by Fazilleau (2003)
  - optimal distance from torch around 5 cm, thus having same initial velocities within the droplet and the plasma gas
  - velocity of 250 m/s observed for 100 nm to 5  $\mu\text{m}$  droplets
  - same properties considered for zirconia,  $T_m = 3000 \text{ K}$
  - plasma gas Ar-H<sub>2</sub> also considered as ideal gas
  - glass substrate not preheated (300K), non-perfect contact (e.g. RTC = 1e-6) so that no substrate melting
  - $T_o = 3800 \text{ K}$  for fluids (average of plasma and droplets)
- partial rarefaction: mean free path of  $\leq 2.47 \mu\text{m}$  for plasma gas at  $\leq 3800 \text{ K}$  and thus  $\text{Kn} < 10$  within transition regime
  - to apply continuum model : Maxwell slip on substrate combined with an effective viscosity model by Beskok & Karniadakis (1999)
- quarter domain  $0.75 \times 1.2 \times 0.75 \mu\text{m}^3$ ,  $60 \times 96 \times 60$  mesh
- conservative VOF, WENO3 (momentum, energy) and TVD (pressure) schemes
- the Neumann boundary conditions around the domain can cause non-physical recirculations of the gas phase



zoomed  
2D view



# Multiple droplet impact

## Simulation of 52 YSZ droplets

$d = 1 \mu\text{m}$   
 $v = 100 \text{ m/s}$

$\text{Re} = 26.34$   
 $\text{We} = 116.17$

$15 \times 15 \mu\text{m}^2$   
SS surface

34.56M points,  
512 processors  
at the MCIA

## Conclusion

- ① Necessity of better initialization of velocity, pressure and temperature
- ② Necessity of improvements at the boundary conditions to avoid non-physical pressure reflection
- ③ Great potential of current methods for multiple droplet impact simulation in suspension plasma spraying
- ④ Possible simulation of hundreds to thousand of submicrometer droplets at a surface of  $30 \times 30 \mu\text{m}^2$  with 2048 processors
- ⑤ Entry data of actual diameters and velocities (as well as spatial and temporal distribution of droplets) at real operating conditions can allow better and larger simulations - tens of thousands droplets - with increasing capacity of supercomputers and GPU solvers
- ⑥ Research may be extended to the use of stochastic methods coupled with an IA to reconstruct interface splats of droplets (trained with 3D simulations)

**Thank you**