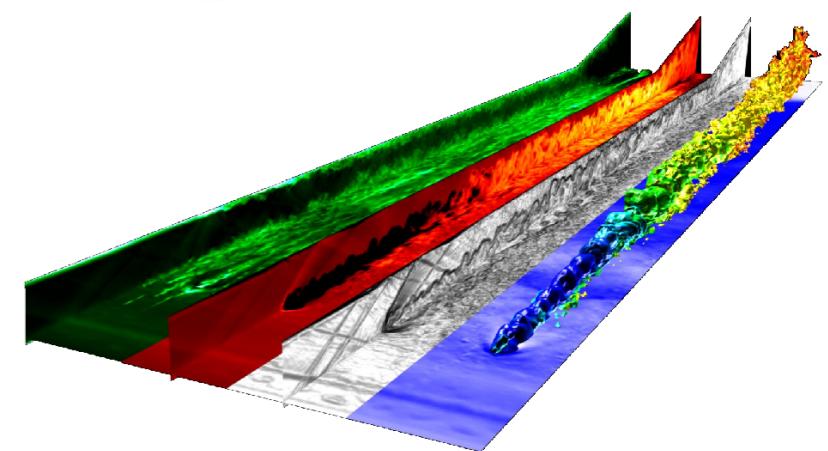
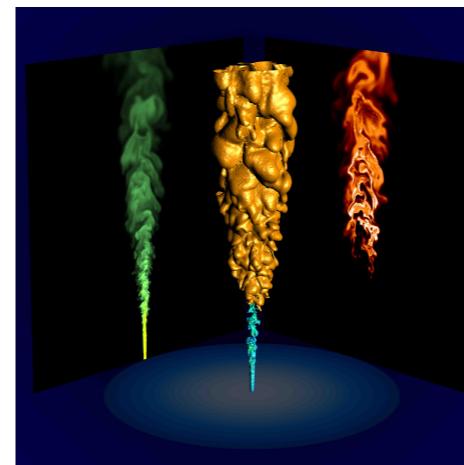
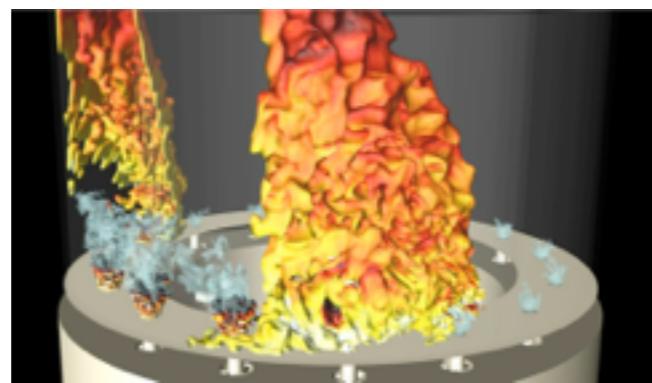
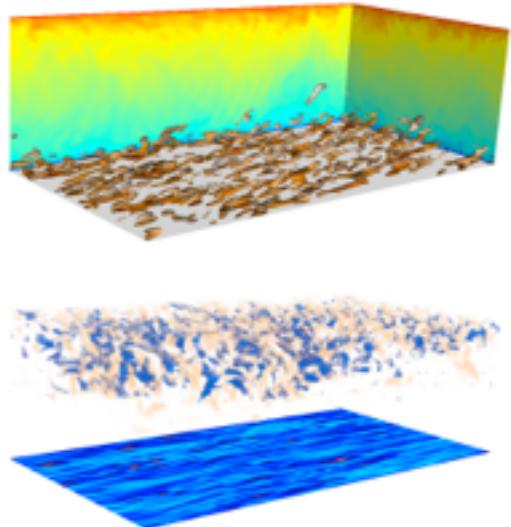


# Numerical Methods in Engineering Applications

## Session #1 Finite Differences

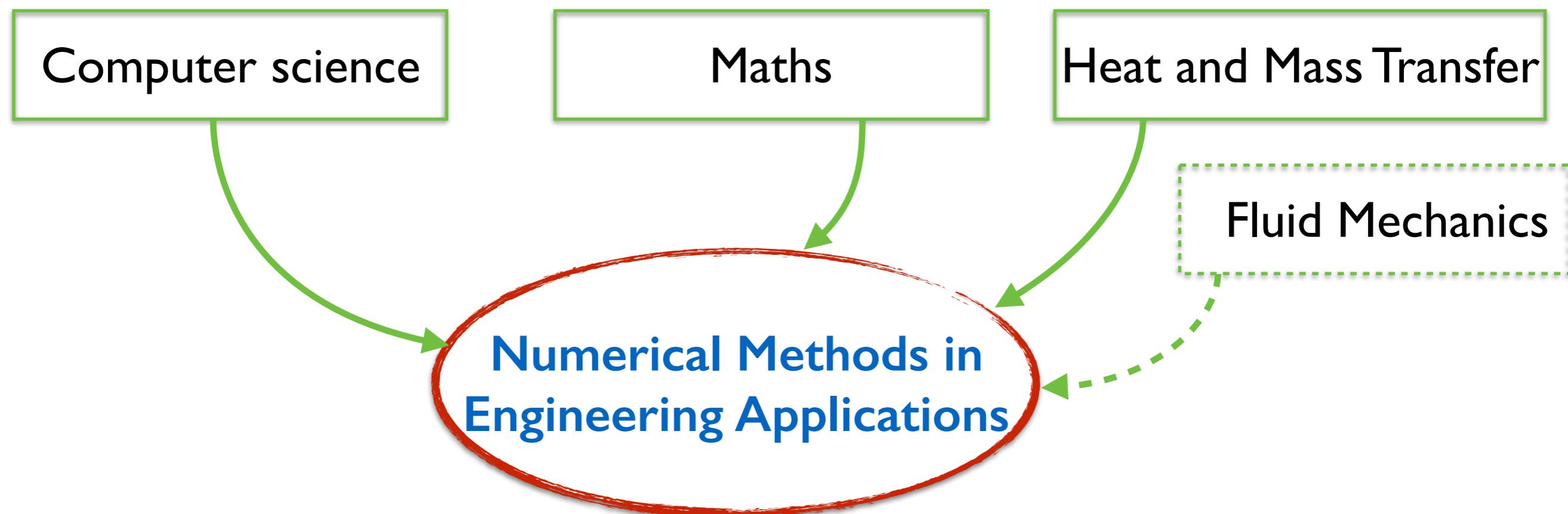
Ronan.Vicquelin@centralesupelec.fr  
Aymeric.Vie@centralesupelec.fr



# Objectives

- Numerical resolution of engineering problems
  - Fluid Mechanics
  - Species mass transfer
  - Heat transfer
  - Chemistry, ...
- Understanding of theoretical contents
- Practice (Python)

# A synthesizing course...



# ... to solve practical cases

Computer science

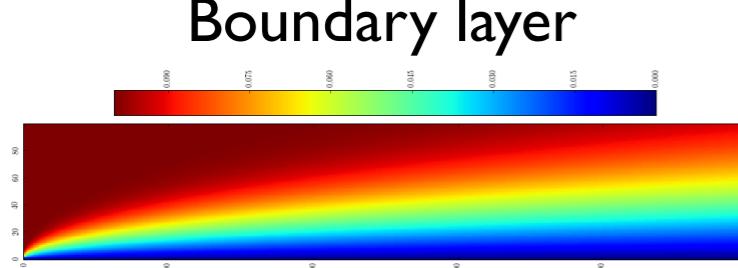
Maths

Heat and Mass Transfer

Fluid Mechanics

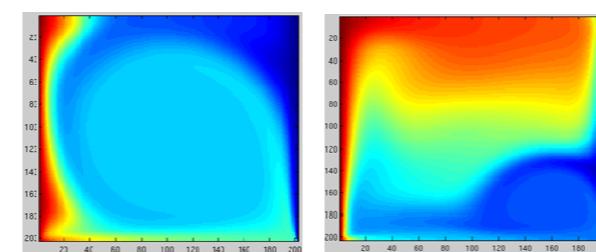
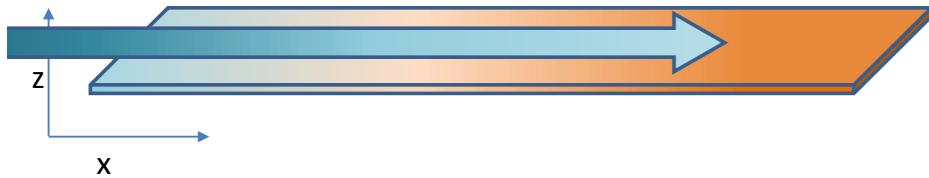
## Numerical Methods in Engineering Applications

Boundary layer

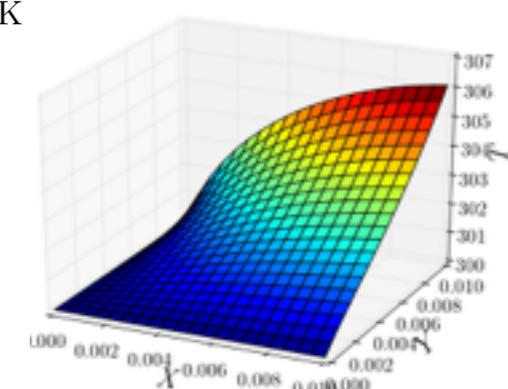
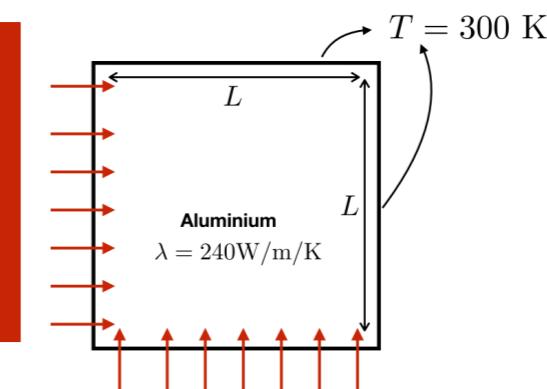


- + Numerical analysis
- + Numerical Efficiency
- + Physical analysis

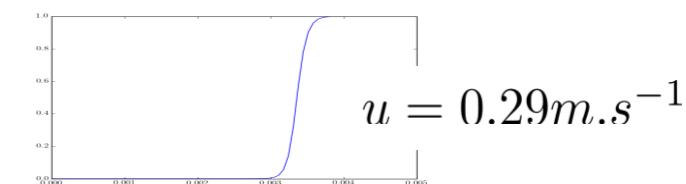
Transient heating



Maximum temperature

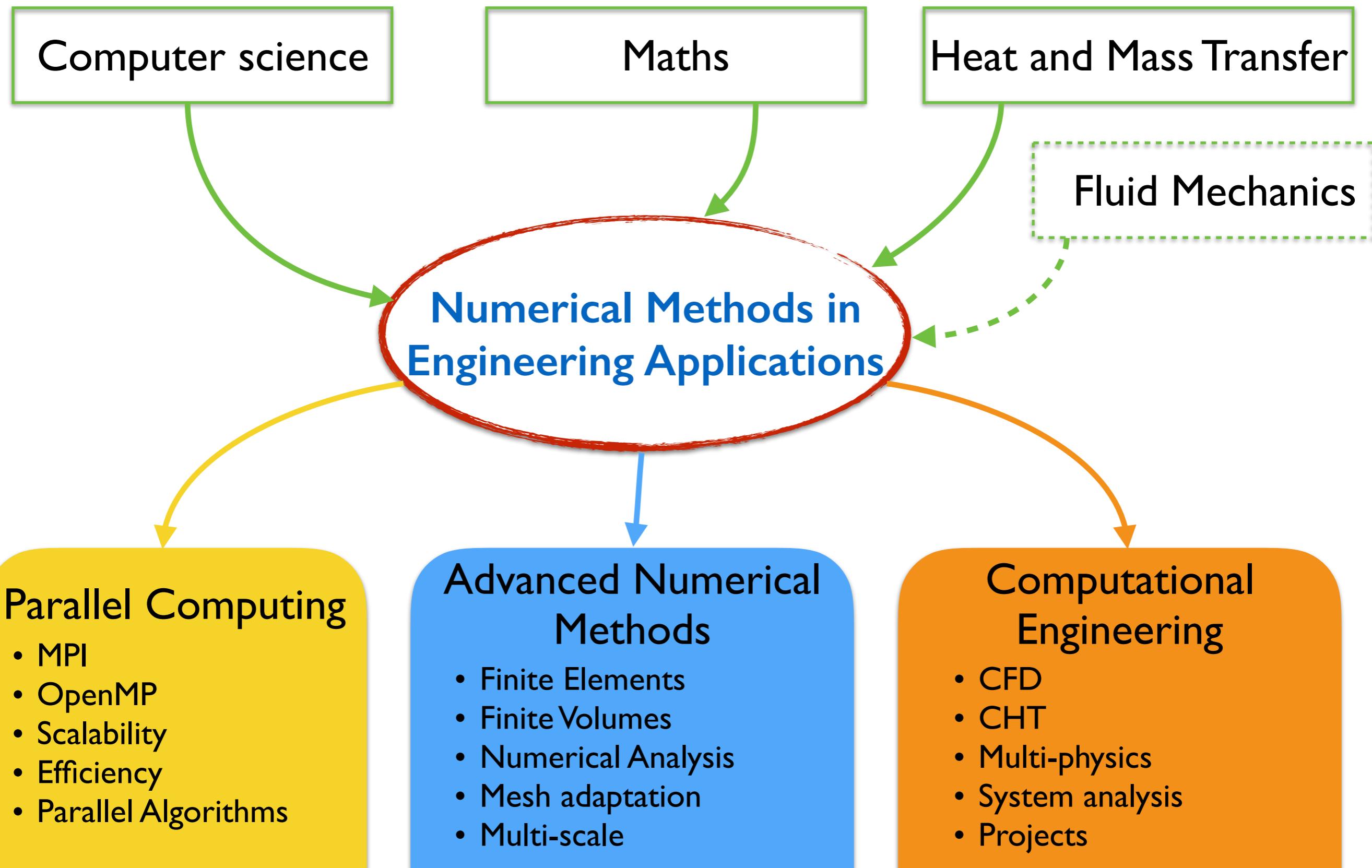


Flame speed



$$u = 0.29 \text{ m.s}^{-1}$$

# ...and to go beyond



# Course contents

- Theoretical lecture
- Problem-solving workshop

## I. Basics on numerical approximations

- Introduction and Finite Differences.
- Numerical solution of ordinary differential equations.



## II. Solving large linear equations systems: Applications to steady heat equation.

- Elliptic PDE 1. ● ■ ■
- Elliptic PDE 2. ● ■

## III. Methods for unsteady advection/diffusion problems

- Hyperbolic and parabolic PDE: Explicit methods.
- Characterization of numerical errors.
- Hyperbolic and parabolic PDE: Implicit methods.



## IV. Towards computational fluid dynamics

- Methodology in numerical computations. ■ ■
- Incompressible Flow equations. ● ■
- Semi-Implicit method for incompressible flows.
- Final project on incompressible flow.



## Brilliant students

- ✓ Theoretical knowledge
- ✓ Not afraid to program  
Welcome to the 21<sup>st</sup> century !
- ✓ Get practical answers
  - Numerically sound and accurate
  - Physically analyzed

65% of practice + projects

# Evaluation

- 1 small project to hand out within a week
- 1 comprehensive mid-term project
- 1 small project to hand out within a week
- 1 comprehensive final project

**Send slides and sources at each deadline**



**Final deadline: send updated slides + final project**

## ECP+R

- 5 sessions
- Evaluation on the first 3 projects

# Course contents

## I. Basics on numerical approximations

- **Introduction and Finite Differences.**
- **Numerical solution of ordinary differential equations.**

→ **Project #1**

## II. Solving large linear equations systems: Applications to steady heat equation.

- **Elliptic PDE 1.**
- **Elliptic PDE 2.**

→ **Project #2**

## III. Methods for unsteady advection/diffusion problems

- **Hyperbolic and parabolic PDE: Explicit methods.**
- **Characterization of numerical errors.**
- **Implicit methods for Parabolic PDE.**

→ **Project #3**

## IV. Towards computational fluid dynamics

- **Methodology in numerical computations.**
- **Incompressible Flow equations.**
- **Semi-Implicit method for incompressible flows.**
- **Final project on incompressible flow.**

→ **Project #4**

# Numerical simulations in Engineering Applications

## Characterize and improve systems

- Experimental investigation still unavoidable but can be extremely expansive
- It is not possible to measure everything everywhere



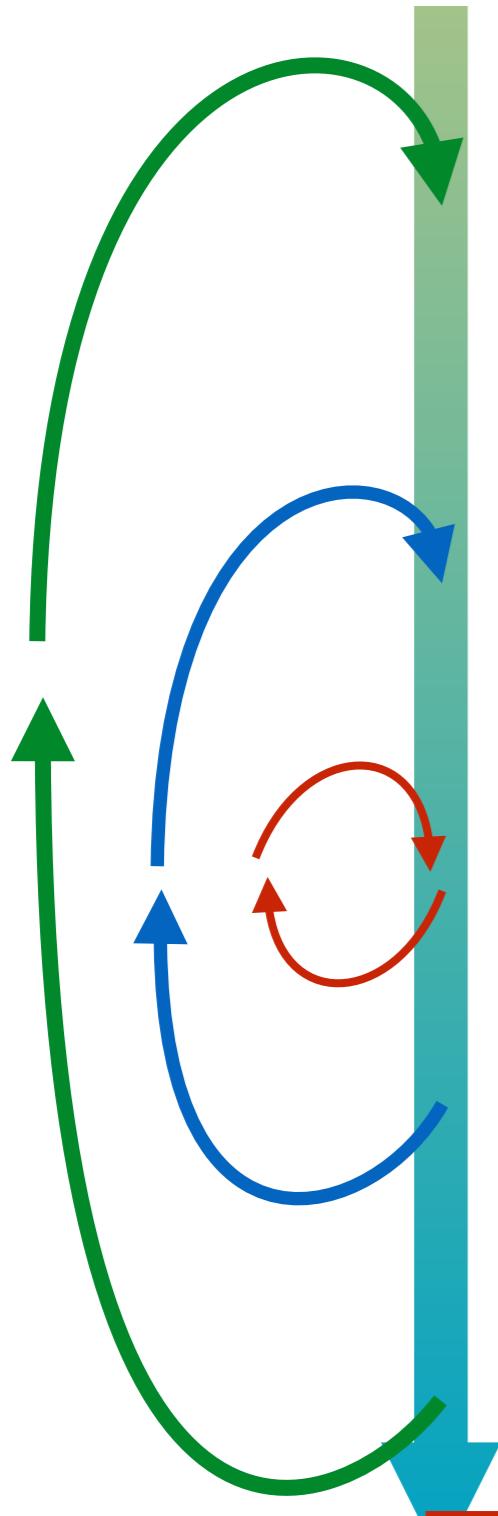
## Numerical simulations

- Reduced cost even for the largest simulations compared to building prototypes
- All fields ( $u, v, w, T, Y_k$ ) are available everywhere at each instant

... but the numerical model must be

- Efficient to be affordable
- Numerically accurate to make sure the discretization errors are controlled
- Validated to verify the physical representation of the system

# Methodology

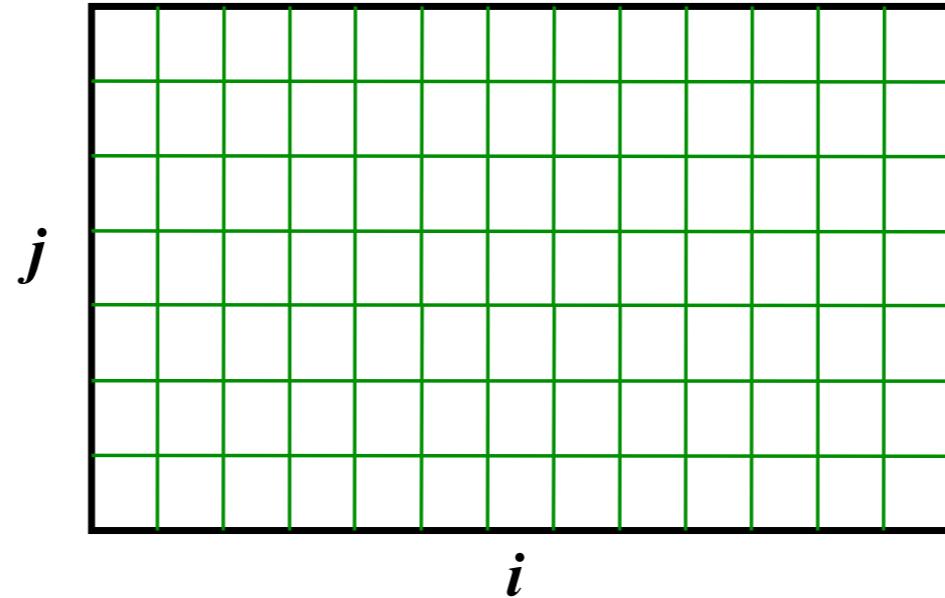


- Set the physical problem
- Formalization: Equations and Hypotheses
- Simplifications, symmetries
- Discretization (structures, unstructured mesh)
- Boundary conditions. Initial conditions.
- **Numerical resolution** (**finite differences**, finite volumes, finite elements, ...)
- Characterization of numerical error (accuracy of the numerical scheme, mesh convergence/adaptation)
- Data post-processing
- Model validation, Verification of hypotheses

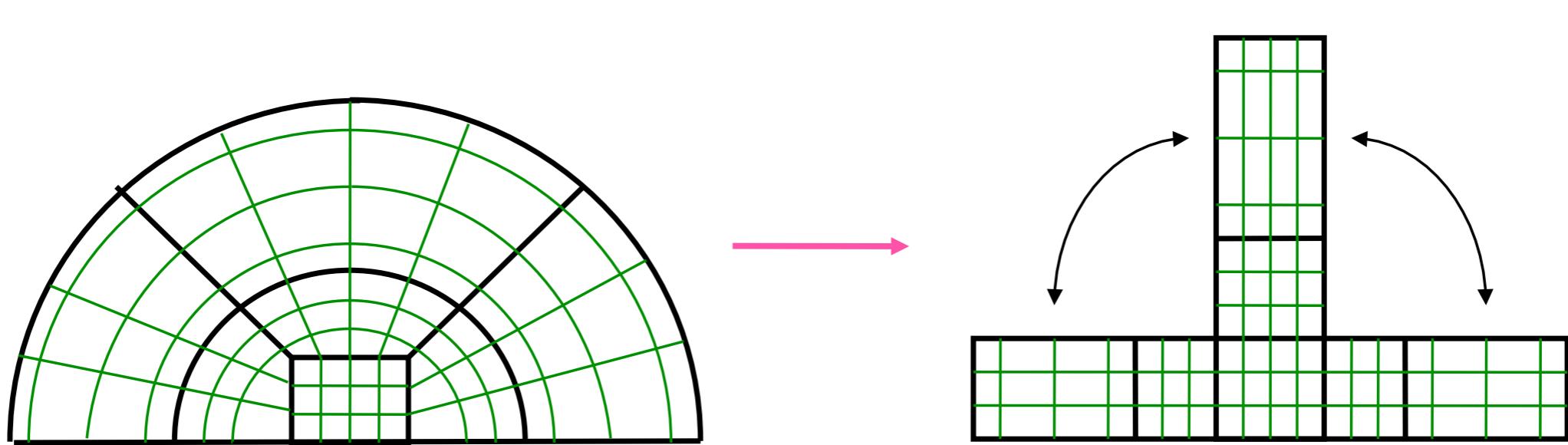
The problem answer

# Meshes

Structured

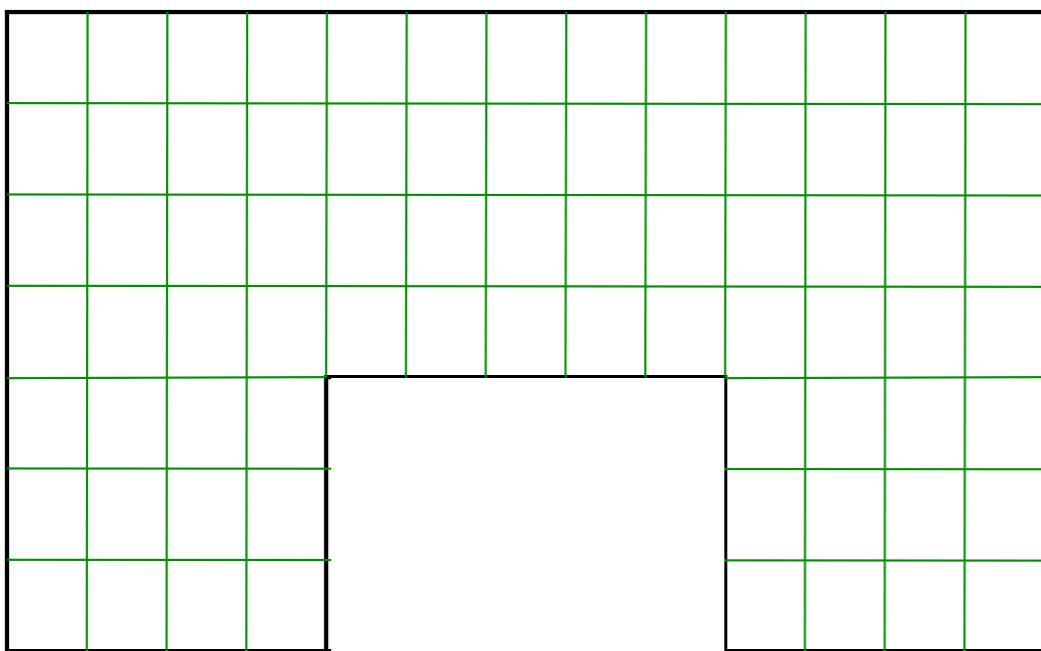


Multi-block Structured

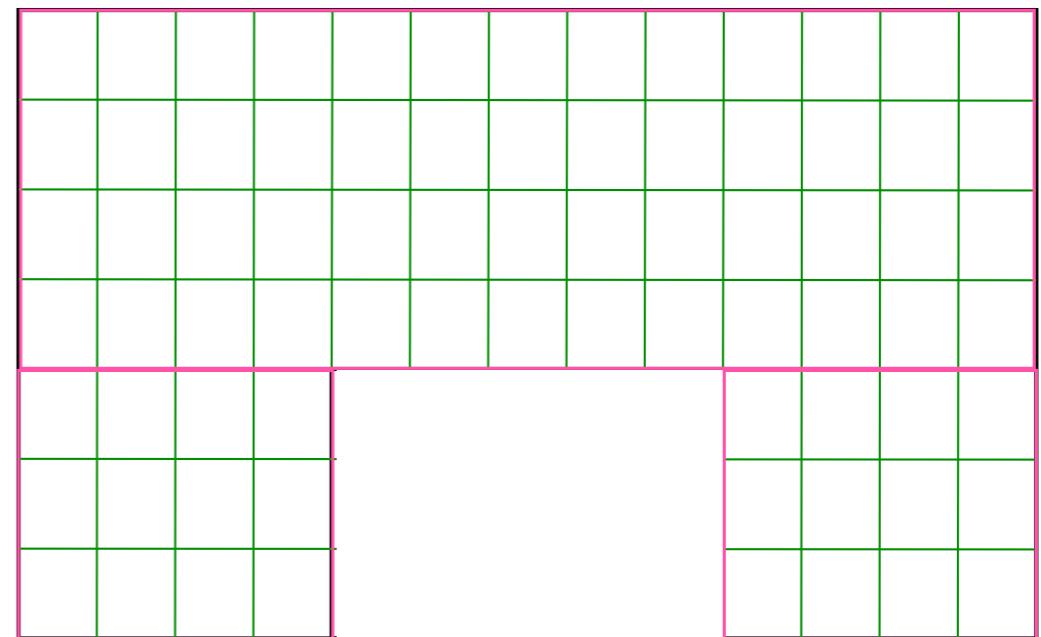


# Meshes

**Unstructured**

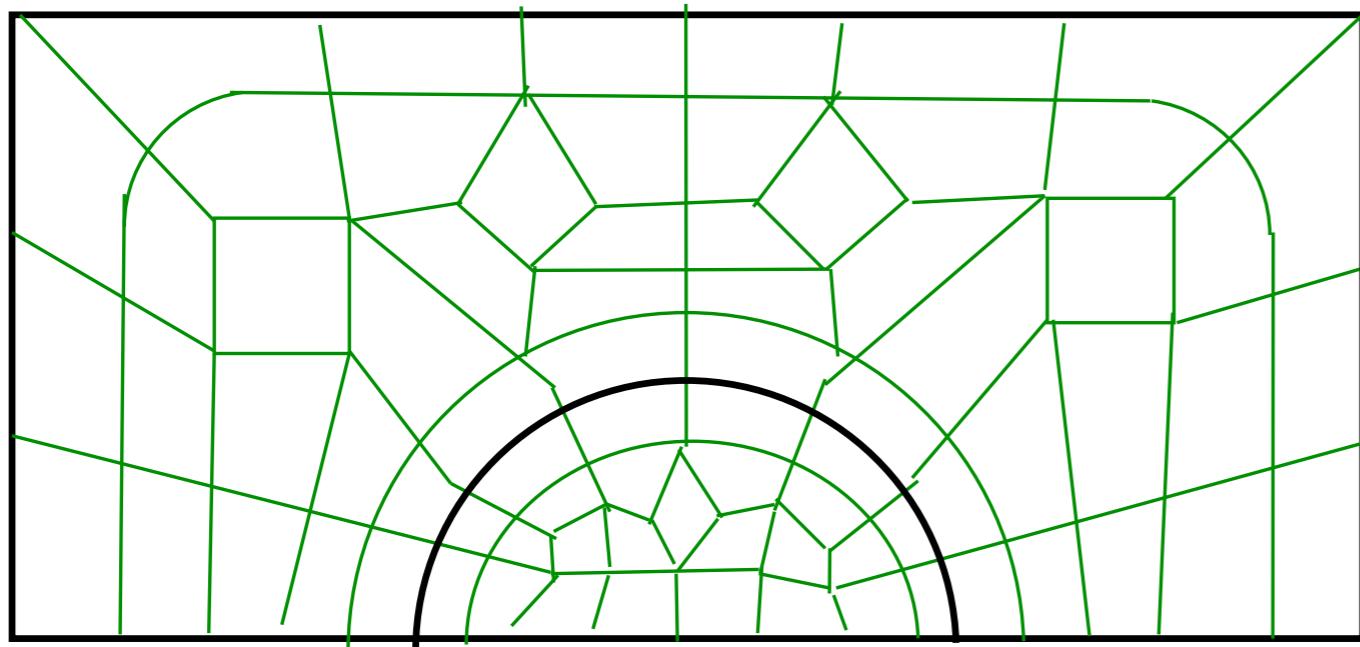


**Multi-block Structured**

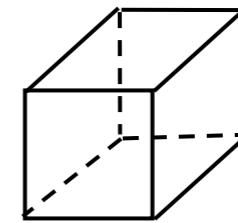


# Meshes

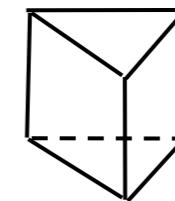
## Unstructured



Hexa



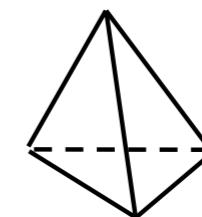
Prisme (wedge)



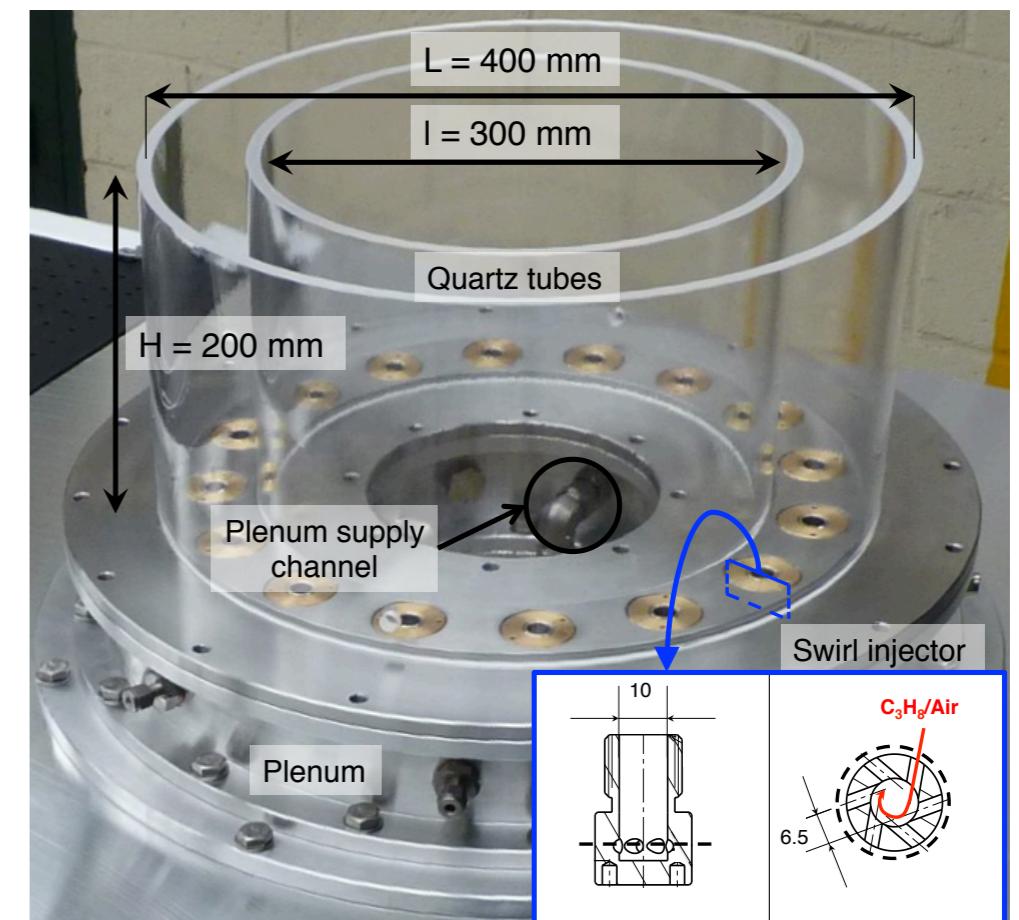
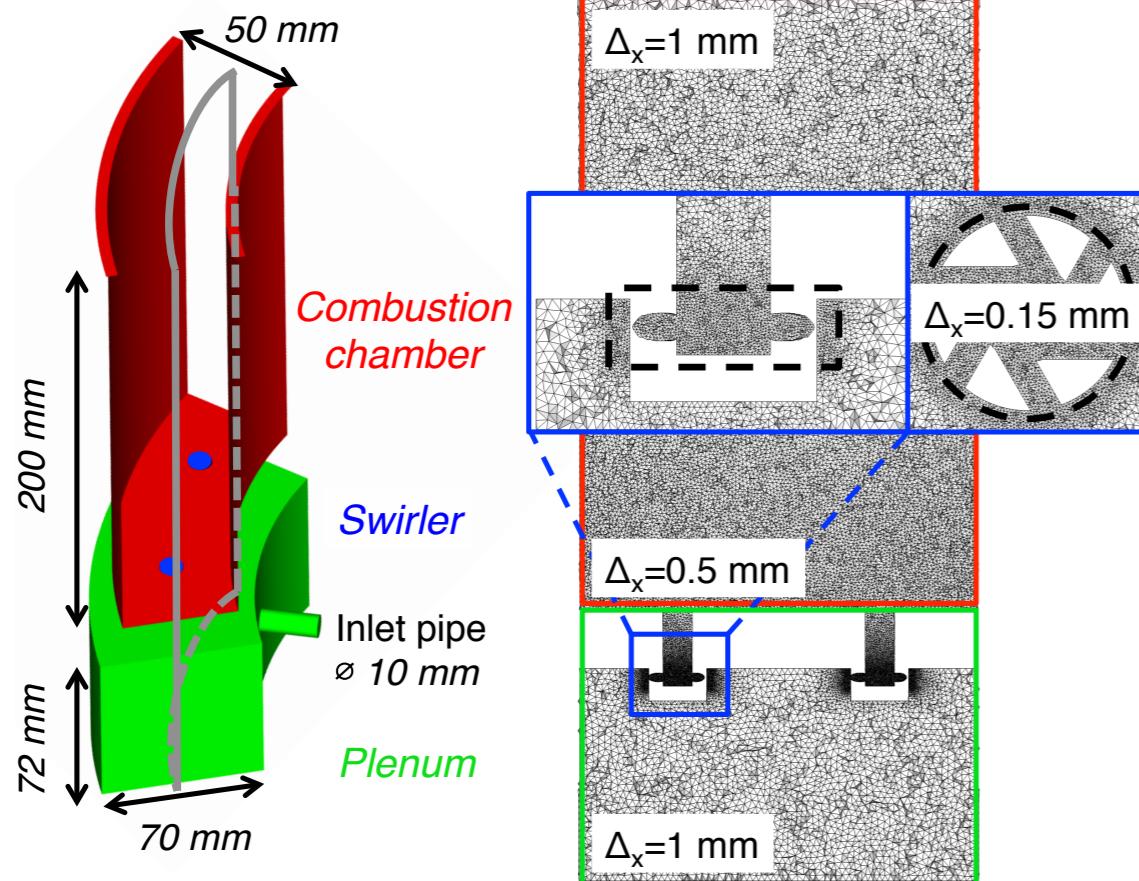
Pyramide  
(transition conforme)  
Hexa / Tétra



tétrahèdre

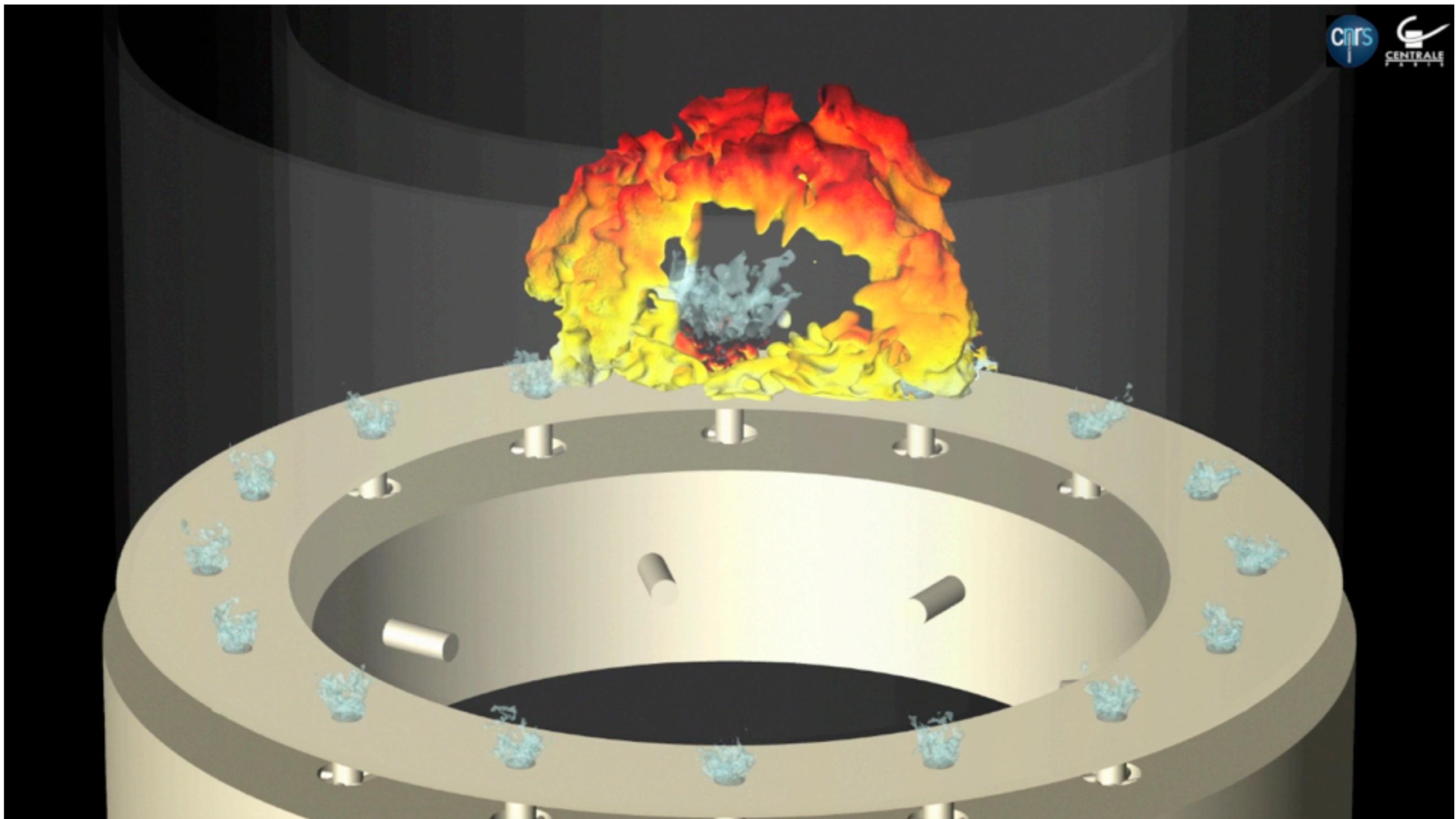


# Example: Large Eddy Simulation of Light-Round



# Example: Large Eddy Simulation of Light-Round

Parallel + Combustion, Fluid Dynamics, Turbulence, ...  
national  
lutional  
ing



# Partial Differential Equations (PDE)

Laplace

$$\frac{\partial^2 T}{\partial x^2} + \frac{\partial^2 T}{\partial y^2} = 0$$

Poisson

$$\frac{\partial^2 T}{\partial x^2} + \frac{\partial^2 T}{\partial y^2} = S$$

Unsteady Heat Equation

$$\frac{\partial T}{\partial t} = a \left( \frac{\partial^2 T}{\partial x^2} + \frac{\partial^2 T}{\partial y^2} \right)$$

Stokes

$$\frac{\partial u}{\partial t} = \nu \frac{\partial^2 u}{\partial y^2}$$

Advection

$$\frac{\partial c}{\partial t} + u_0 \frac{\partial c}{\partial x} = 0$$

Wave Equation

$$\frac{\partial^2 u}{\partial t^2} - c^2 \frac{\partial^2 u}{\partial x^2} = 0$$

ODE

$$\frac{dY_k}{dt} = \frac{\dot{\omega}_k}{\rho}$$

# General Equations (Energetics applications)

- Fluid Mechanics + Heat Transfer+ Mass Transfer:

$$\frac{\partial \rho}{\partial t} + \frac{\partial}{\partial x_i} (\rho u_i) = 0$$

$$\rho \frac{\partial v_i}{\partial t} + \rho v_j \frac{\partial v_i}{\partial x_j} = \rho g_i - \frac{\partial p}{\partial x_i} + \frac{\partial \tau_{ij}}{\partial x_j}$$

$$\rho c_p \frac{\partial T}{\partial t} + \rho c_p v_j \frac{\partial v_i}{\partial x_j} = \frac{\partial p}{\partial t} + v_j \frac{\partial p}{\partial x_j} + \tau_{ij} \frac{\partial v_i}{\partial x_j} + \dot{\Omega} - \frac{\partial q_j}{\partial x_j} - \sum_{k=1}^N h_k \dot{\omega}_k + \sum_{k=1}^N \rho V_{k,j} Y_k c_{pk} \frac{\partial T}{\partial x_j}$$

$$\rho \frac{\partial Y_k}{\partial t} + \rho v_j \frac{\partial Y_k}{\partial x_j} = - \frac{\partial}{\partial x_j} (\rho V_{k,j} Y_k) + \dot{\omega}_k$$

# General conservative form of the equations

$$\frac{\partial \mathbf{U}}{\partial t} + \nabla \cdot \mathbf{F}(\mathbf{U}, \nabla \mathbf{U}) = \mathbf{S}$$

- Fluid Mechanics + Heat Transfer+ Mass Transfer

$$\mathbf{U} = \begin{pmatrix} \rho \\ \rho v_1 \\ \rho v_2 \\ \rho v_3 \\ \rho(e + \frac{1}{2}v_i v_i) \\ \rho Y_1 \\ \vdots \\ \rho Y_N \end{pmatrix} \quad \mathbf{F} = \begin{pmatrix} \quad \\ \quad \\ \vdots \\ \quad \end{pmatrix} \quad \mathbf{S} = \begin{pmatrix} 0 \\ \rho g_1 \\ \rho g_2 \\ \rho g_3 \\ \mathbb{P} \\ \dot{\omega}_1 \\ \vdots \\ \dot{\omega}_N \end{pmatrix}$$

# PDE Classification

- **Order-1 PDE**

$$\frac{\partial \mathbf{U}}{\partial t} + \mathbf{A} \frac{\partial \mathbf{U}}{\partial x} = \mathbf{S}$$

A Eigenvalues	PDE Type
Complex (non-real)	Elliptic
Real	Hyperbolic
Complex and real	Hybrid
Rank(A) < n	Parabolic

# PDE Classification

- **Order-2 PDE**

$$\sum_{i,j} a_{ij} \frac{\partial^2 U}{\partial x_i \partial x_j} = 0 \rightarrow \sum_{i,j} a_{ij} X_i X_j = 0$$

Type of the PDE hyperplane  $\rightarrow$  Type of the PDE

Example :  $A \frac{\partial^2 u}{\partial x^2} + B \frac{\partial^2 u}{\partial x \partial y} + C \frac{\partial^2 u}{\partial y^2} = 0 \rightarrow AX^2 + BXY + CY^2 = 0$

$\Delta = B^2 - 4AC$	PDE Type
$\Delta < 0$	Elliptique
$\Delta = 0$	Parabolique
$\Delta > 0$	Hyperbolique

More details: See C. Hirsh's Numerical Computation of Internal & External Flows

# Physical definition

- **Hyperbolic**
  - Purely propagative wave solutions exists
  - Ex: advection
- **Parabolic**
  - Only one type of wave solutions : damped waves
  - Ex: Unsteady diffusion
- **Elliptic**
  - No wave solutions
  - Ex: Steady Diffusion

Nomenclature for order 1 and 2 denotes the same physics

# Elliptic/Parabolic/Hyperbolic

- **Elliptic**

- No notion of propagation of physical information
- Solution at a point depends on the whole field, and reciprocally.
- Requires BCs on the entire domain border

- **Parabolic**

- Propagation of information along one preferred direction
- Solution at a point depends on a half-space domain
- Requires an “initial condition”
- Requires BCs for directions different from the preferred one

- **Hyperbolic**

- Propagation of information at finite speed along one or several directions
- Solution at a point depends on a region delimited by the PDE characteristics
- Requires an “initial condition”
- Requires BCs only where information is incoming

# 2D Euler equations, steady, isentropic

$$\frac{\partial \rho u}{\partial x} + \frac{\partial \rho v}{\partial y} = 0$$

Mass conservation

$$u \frac{\partial u}{\partial x} + v \frac{\partial u}{\partial y} + \frac{1}{\rho} \frac{\partial p}{\partial x} = 0$$

Momentum along x-axis

$$u \frac{\partial v}{\partial x} + v \frac{\partial v}{\partial y} + \frac{1}{\rho} \frac{\partial p}{\partial y} = 0$$

Momentum along y-axis

$$p = k \rho^\gamma \quad \frac{\partial p}{\partial x} = c^2 \frac{\partial \rho}{\partial x}$$

$$\frac{\partial p}{\partial y} = c^2 \frac{\partial \rho}{\partial y}$$

Isentropic

## 2D Euler equations, steady, isentropic

$$A \frac{\partial U}{\partial x} + B \frac{\partial U}{\partial y} = 0$$

$$U = \begin{pmatrix} u \\ v \\ Log p \end{pmatrix}$$

$$A = \begin{bmatrix} u & 0 & c^2/\gamma \\ 0 & u & 0 \\ \gamma & 0 & u \end{bmatrix}$$

$$B = \begin{bmatrix} v & 0 & 0 \\ 0 & v & c^2/\gamma \\ 0 & \gamma & v \end{bmatrix}$$

## 2D Euler equations, steady, isentropic

$$\frac{\partial U}{\partial x} + M \frac{\partial U}{\partial y} = 0$$

$$M = A^{-1}B = \frac{1}{u^2 - c^2} \begin{bmatrix} uv & -c^2 & -vc^2/\gamma \\ 0 & \frac{v}{u}(u^2 - c^2) & \frac{c^2}{u\gamma}(u^2 - c^2) \\ -v\gamma & u\gamma & uv \end{bmatrix}$$

M Eigenvalues :  $\lambda_1 = \frac{v}{u}$        $\lambda_2 = \frac{uv}{u^2 - c^2} \pm \frac{c^2}{u^2 - c^2} \sqrt{Mach^2 - 1}$

# Euler 2D, stationnaire, isentropique

$$\text{M Eigenvalues : } \lambda_1 = -\frac{v}{u} \quad \lambda_2 = \frac{uv}{u^2 - c^2} \pm \frac{c^2}{u^2 - c^2} \sqrt{Mach^2 - 1}$$

If  $Mach < 1$

Hybrid: Elliptic-Hyperbolic

If  $Mach = 1$

Parabolic

If  $Mach > 1$

Hyperbolic

# Numerical discretization

- The real solution is approximated by a discrete solution  
=> Finite number of degrees of freedom to represent the solution
- The numerical solution is governed by a discrete “PDE” where derivative operators are discretized
- **Finite Differences:** The solution values are stored at the mesh nodes.

Taylor series

- **Finite Volumes:** The cell-averaged value is stored

Conversation equation integrated on the cell

- **Finite Elements :** Expansion on basis functions

Variational Formulation

Unstructured  
Mesh