

# Hemodynamic Modeling of Cerebral Aneurysms: Coupling 4D Flow MRI and Finite Element Simulations

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# Clinical context

## Cerebral aneurysms

### Key Statistics

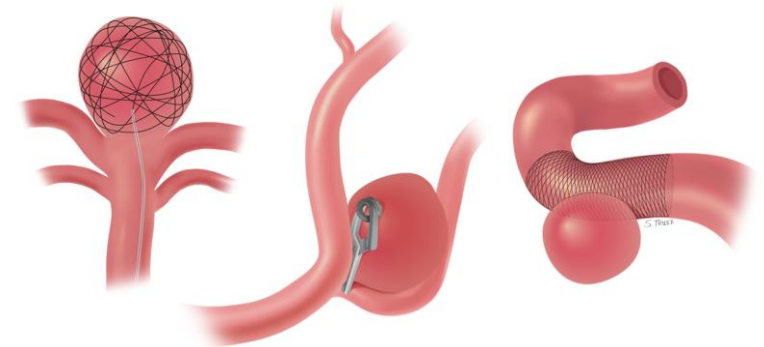
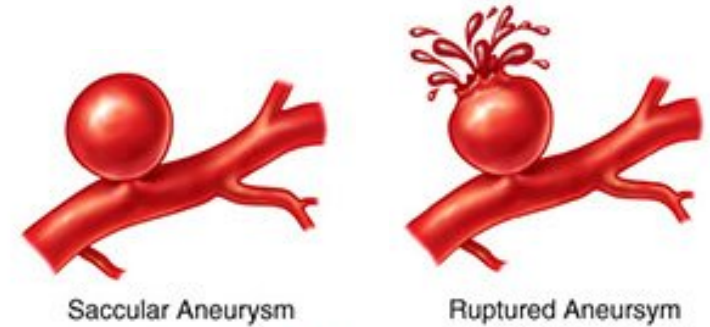
- **Prevalence:** 5% of the population affected
- **Mortality:** 60% within 3 months post-rupture

### Risk Factors

- **Exogenous:** Hypertension, age, ethnicity, smoking
- **Endogenous:** Size and location of the aneurysm

### Treatment Options

- **Surgical:** Neurosurgery
- **Minimally Invasive:** Endovascular intervention





# Clinical context

## Innovation in vascular imaging: The 4D flow MRI sequence

### Technology

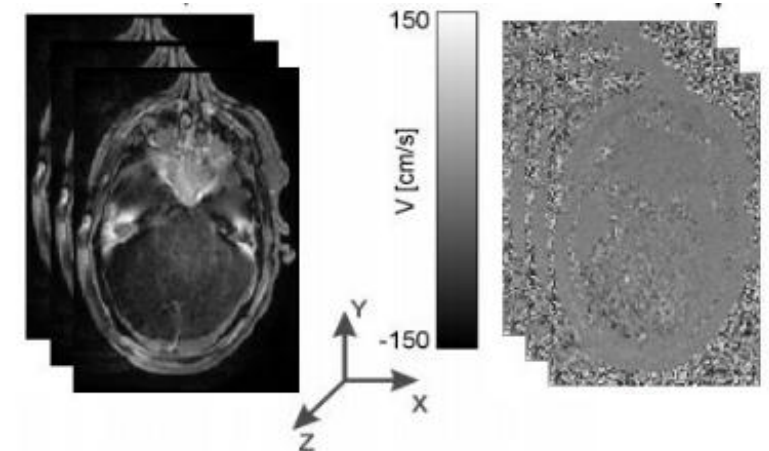
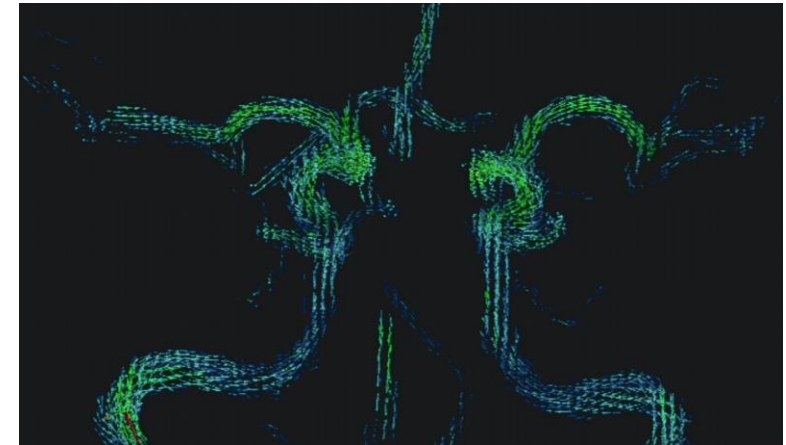
- Combines **morphological imaging** (anatomy) and **functional imaging** (blood flow).
- **4D = 3D spatial + temporal dimension.**
- **Velocity encoding:** The phase shift of proton spins is proportional to blood flow velocity:  $\Delta\phi = \gamma v G t^2$ .

### Advantages

- **Non-invasive visualization** of blood flow velocities  $v(x,y,z,t)$  and flow direction.
- Detection of **hemodynamic anomalies** (turbulence, stagnation zones).

### Applications

- Assessing the **risk of rupture in cerebral aneurysms.**
- Analyzing **vascular malformations** (stenoses, fistulas).







# Clinical context

## Better diagnosis of aneurysm evolution

### Objectives

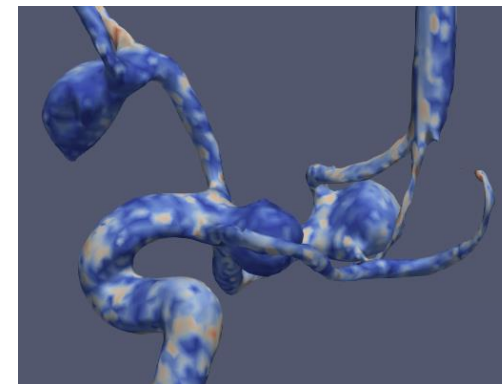
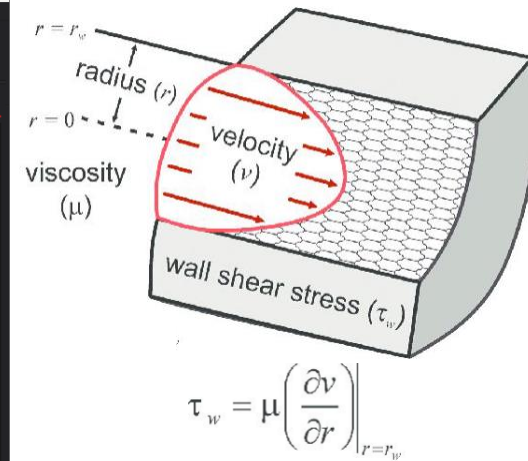
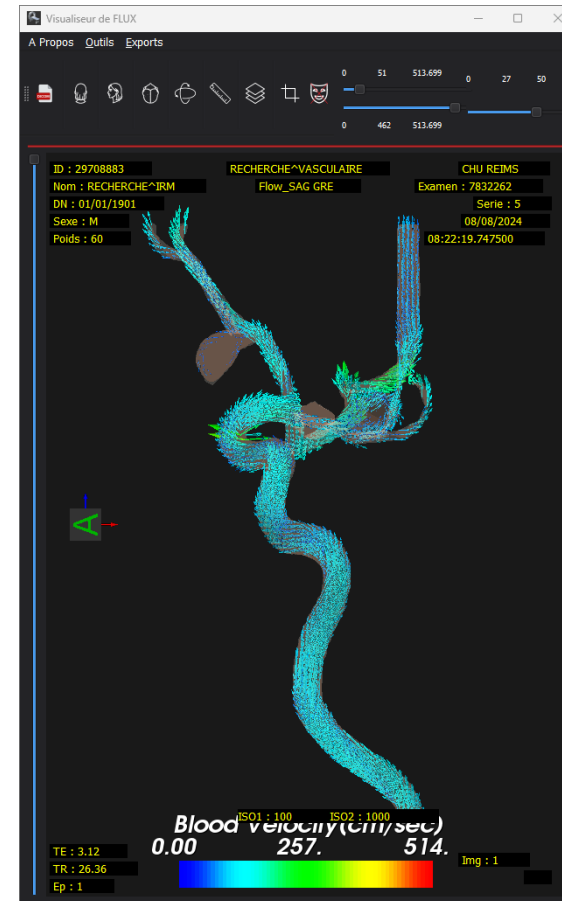
- **Direct assessment of aneurysm rupture risk** using MRI imaging
- **Using computational fluid dynamics (CFD)** to compute key markers of aneurysm evolution
- **Comparative analysis** between MRI images and simulation results to optimize and adapt simulation parameters

### Key Markers of Aneurysm Growth

- **Hemodynamic markers:** Wall shear stress (WSS) and derived indicators
- **Flow dynamics:** Residence time (RT) as a critical parameter

### Visualization for Clinical Application

- **Development of MRProject software:** An MRI-integrated tool for visualizing 4D flow images, volumetric data, and dynamic changes
- **Enhanced visualization:** Surface viewer with color-coded indicators for intuitive clinical interpretation





# Steady Stokes

## Steady Stokes Equations

- **Laminar flows** (Reynolds number < 2000)
- Approximation of **Navier-Stokes equations** for small cerebral arteries

## Unknowns and Parameters

- $\mathbf{u}$  Blood velocity,  $p$  Pressure,  $\mu$  Dynamic viscosity,  $\mathbf{u}_{in}$  Inlet velocity
- $\Omega$  Study domain,  $\Gamma_{in}$  Inlet surface,  $\Gamma_{out}$  Outlet surface,  $\Gamma_{wall}$  Vessel wall
- $g$  Outflow function of the fluid
- $V = H^1_{\Gamma_D}(\Omega)^3$  and  $Q = L^2(\Omega)$

**Convergence problems with high resolution problems (>200k tetrahedras)**

$$\left\{ \begin{array}{ll} -\mu \Delta \mathbf{u} + \nabla p = 0 & \text{in } \Omega \\ \nabla \cdot \mathbf{u} = 0 & \text{in } \Omega \\ \mathbf{u} = \mathbf{u}_{in} & \text{on } \Gamma_{in} \\ \mathbf{u} = 0 & \text{on } \Gamma_{wall} \\ \mu \frac{\partial \mathbf{u}}{\partial \mathbf{n}} + p \cdot \mathbf{n} = g & \text{on } \Gamma_{out} \end{array} \right.$$

Find  $(\mathbf{u}, p) \in V \times Q$  where

$$\left\{ \begin{array}{ll} \int_{\Omega} (\mu \nabla \mathbf{u} : \nabla \mathbf{v} - p(\nabla \cdot \mathbf{v})) dx = \int_{\Gamma} g \cdot \mathbf{v} ds & \forall \mathbf{v} \in V \\ \int_{\Omega} (\nabla \cdot \mathbf{u}) q dx = 0 & \forall q \in Q \end{array} \right.$$



# Dimensionless Stokes

## Parameters

- **Characteristic length scale**  $L$  (area, diameter, radius, etc.)
- $\rho$  constant (density)
- $\nu$  dynamic viscosity (constant)
- **Characteristic velocity**  $U$  (maximal inlet velocity)

## Dimensionless variables

- velocity  $u^* = \frac{u}{U}$
- pressure  $p^* = \frac{p}{\rho U^2}$
- gradient  $\nabla^* = L \nabla$
- Laplacian  $\Delta^* = L^2 \Delta$

## Spaces

- $V^* = H_{\Gamma_D}^1(\Omega)^3$  and  $Q^* = L^2(\Omega)$

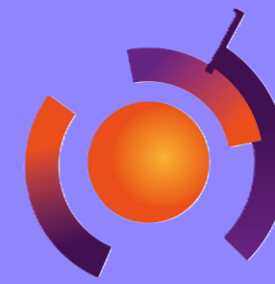
$$\left\{ \begin{array}{ll} -\frac{\nu}{L\rho U} \Delta^* u^* + \nabla^* p^* = 0 & \text{in } \Omega \\ \nabla^* \cdot u^* = 0 & \text{in } \Omega \\ u^* = u_{in}^* & \text{on } \Gamma_{in} \\ u^* = 0 & \text{on } \Gamma_{wall} \\ \mu \frac{\partial u^*}{\partial n} + p^* \cdot n = 0 & \text{on } \Gamma_{out} \end{array} \right.$$

Find  $(u^*, p^*) \in V^* \times Q^*$  where

$$\left\{ \begin{array}{ll} \int_{\Omega} \left( \frac{\nu}{L\rho U} \nabla^* u^* : \nabla^* v^* - p^* (\nabla^* \cdot v^*) \right) dx = 0 & \forall v^* \in V^* \\ \int_{\Omega} (\nabla^* \cdot u^*) q^* dx = 0 & \forall q^* \in Q^* \end{array} \right.$$



# Parallel simulations



HPC Center

# ROMEO

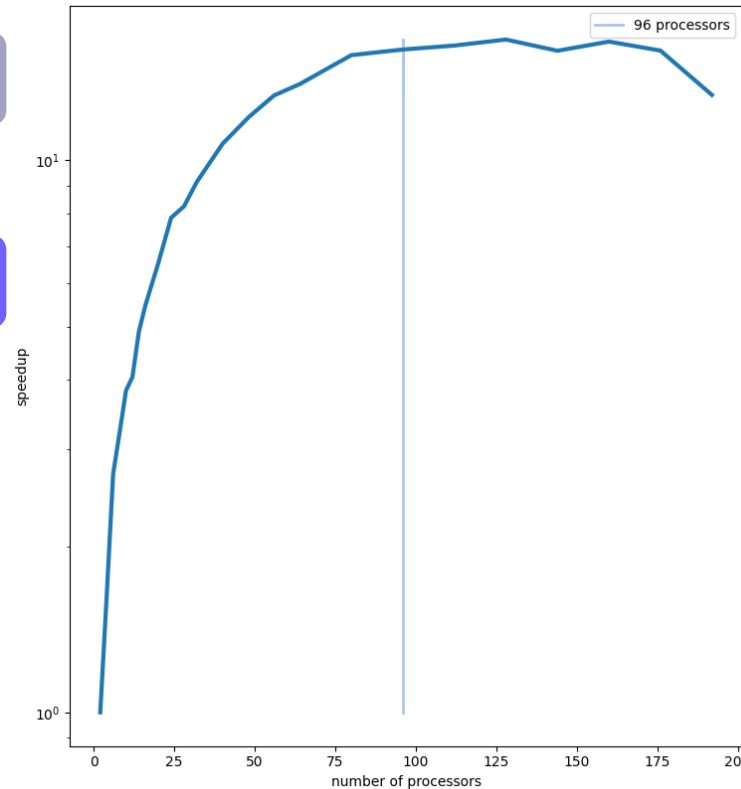
Centre de Calcul Régional

## Parameters

- -pc\_type lu -ksp\_type preonly
- Petsc, P2-P1

## Supercomputer Roméo

- Accelerated Computing Module (ARM+GPU architecture)
- **Scalar CPU Computing Module**
  - **44 AMD64 servers**, each equipped with **2 AMD EPYC 9654 processors** (96 cores each).
  - **192 CPU cores per server** and **1152 GB of memory** (with 4 "Fat" servers offering 1536 GB each).
  - **Total resources**: 8,448 x86 CPU cores and 53 TB of memory.
- **Use of container tools** like Apptainer and Singularity



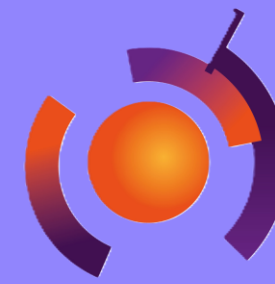
$$\text{Speedup } (S(p)) = \frac{T_{\text{exec}}(1)}{T_{\text{exec}}(p)}$$







# Parallel simulations



HPC Center

# ROMEO

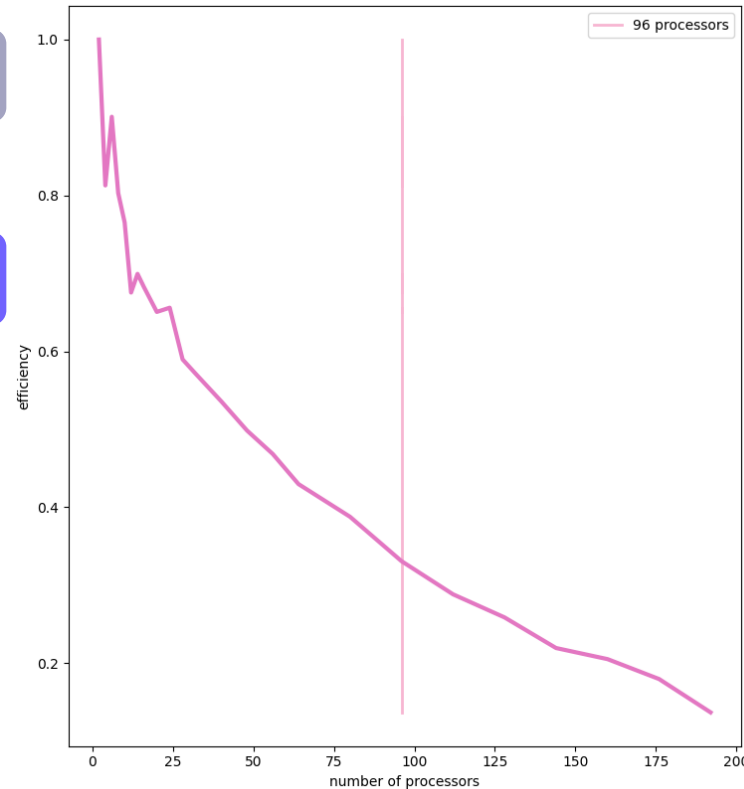
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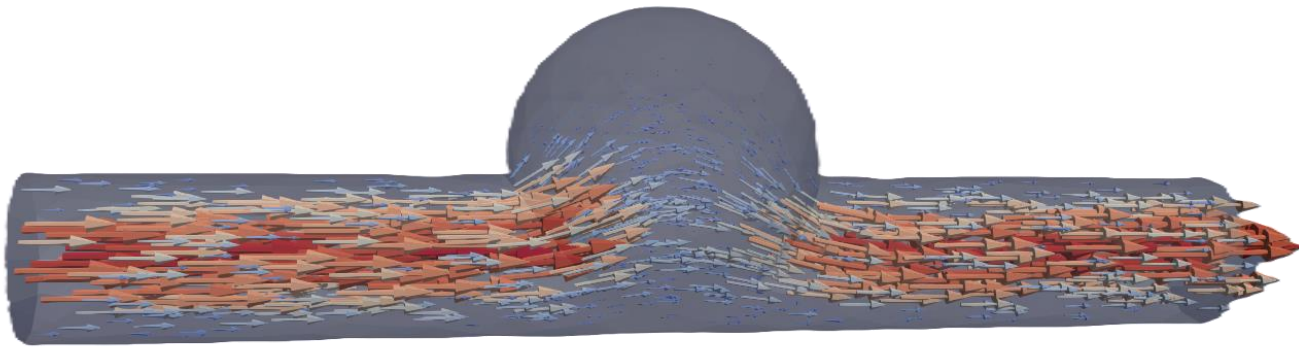
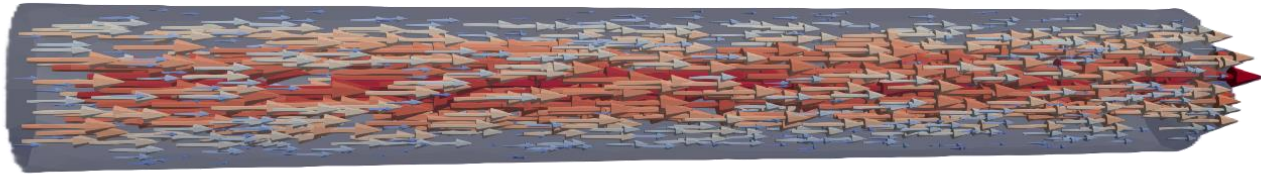


$$\text{Efficiency } \left( E(p) = \frac{T_{exec}(1)/p}{T_{exec}(p)} \right)$$





# Preliminary results

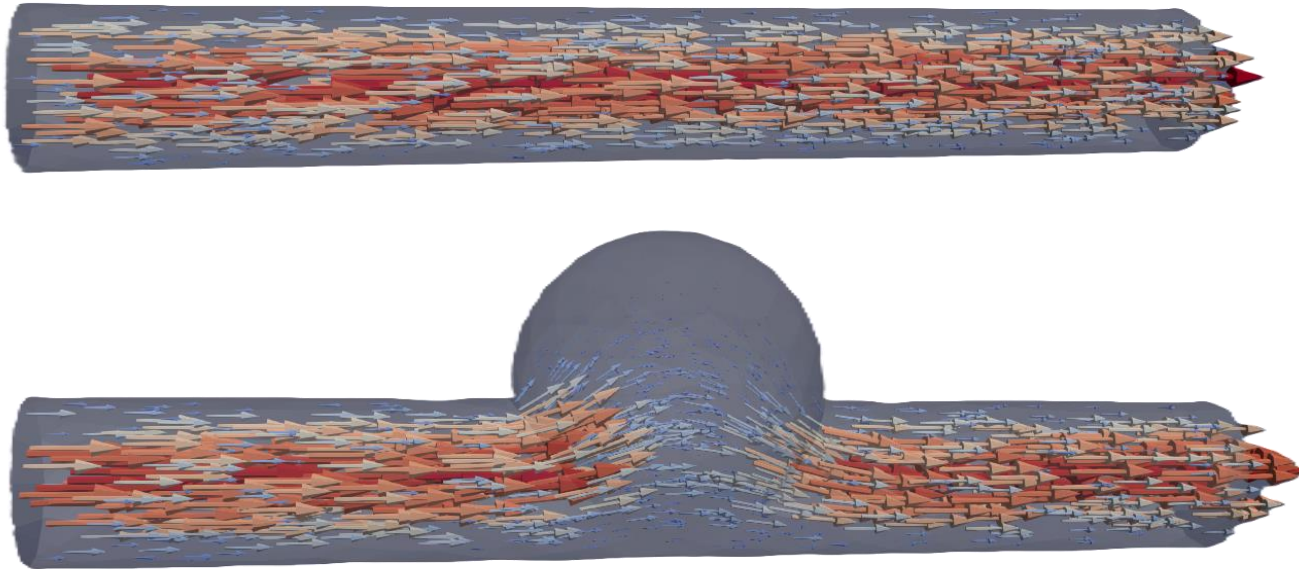


Convergence of the dimensionless Stokes solution on ideal meshes

- 2M degrees of freedom (meshes of 460k tetrahedras)

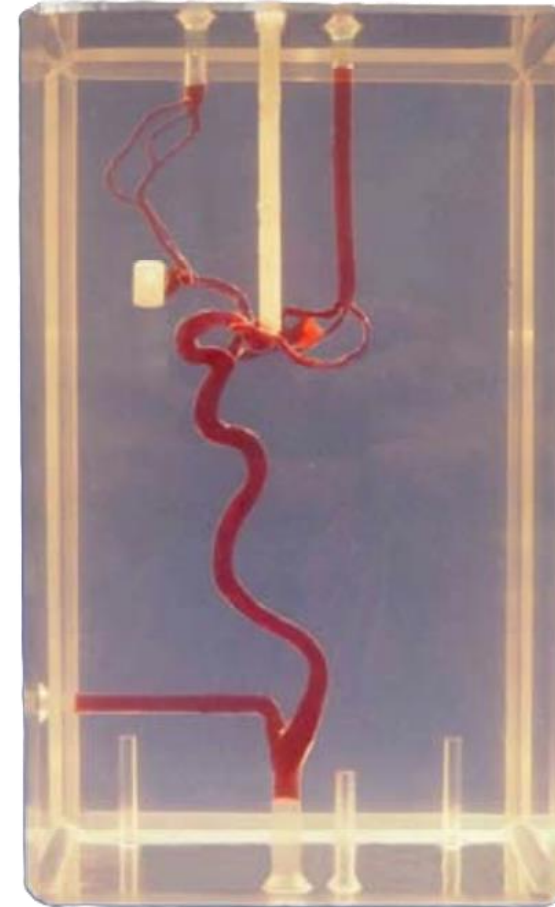


# Preliminary results



Convergence of the dimensionless Stokes solution on ideal meshes

- 2M degrees of freedom (meshes of 460k tetrahedras)



- **Realistic vascular geometry**
- **Vascular phantom:** A silicone model based on real patient geometry, featuring **three aneurysms**.
- **Consistent geometry** enables reliable and repeatable testing in MRI.





# The mesh pipeline

## MRI Segmentation Process

- Apply thresholding to the anatomical series of the 4D flow sequence at a resolution of **1 mm<sup>3</sup>**.
- Extract vessel geometry from MRI data.
- Export results in **VTK** (for visualization) and **MHA** formats.

## AngioTK Pipeline

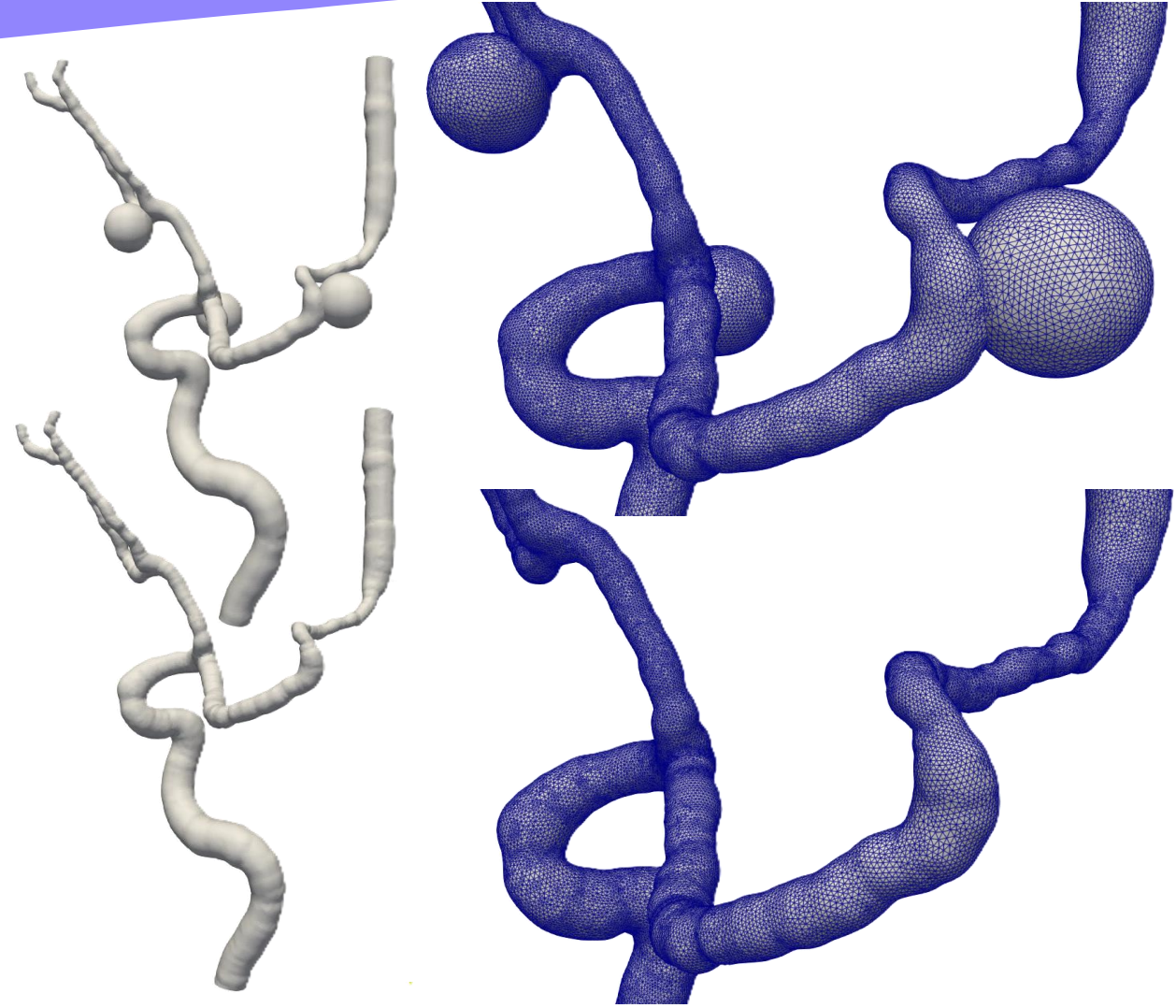
- Manually place entry and exit seeds for each vessel segment.
- Compute centerlines and rays using **VMTK**.
- Generate and clean the surface mesh using **VMTK**, **Gmsh**, and **Mmg**.

## Aneurysm Integration

- Use **CAD software** (e.g., FreeCAD) to model aneurysms as spheres.
- Merge aneurysm meshes with the vessel geometry.
- Validate anatomical accuracy by comparing with MRI data.

## Adaptive Mesh Refinement

- Refine mesh using **Mmg** and adjust labels for consistency and clarity.
- Vessel mesh: **600k tetrahedras**, vessel with aneurysm mesh: **650k tetrahedras**.

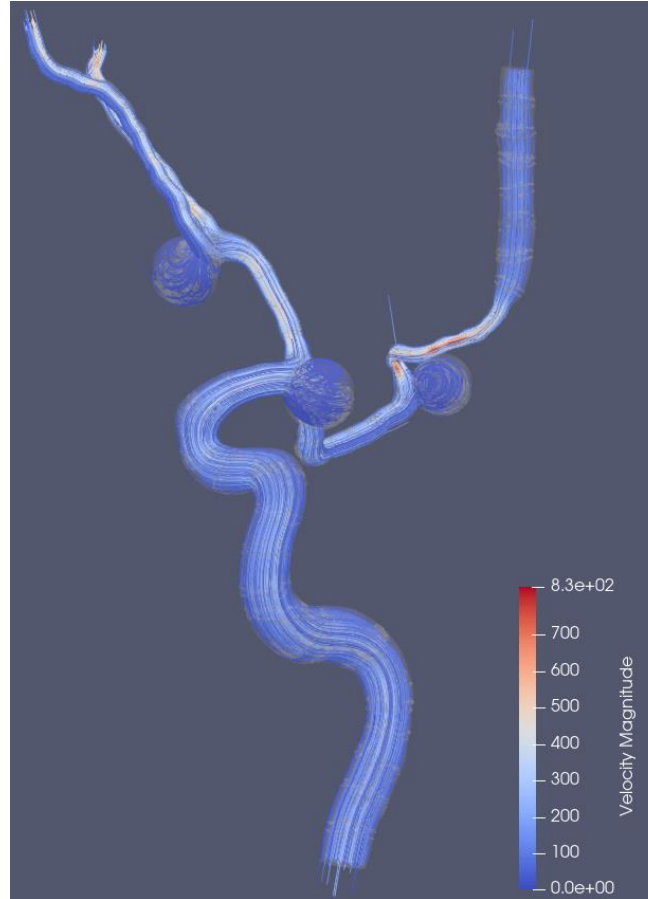
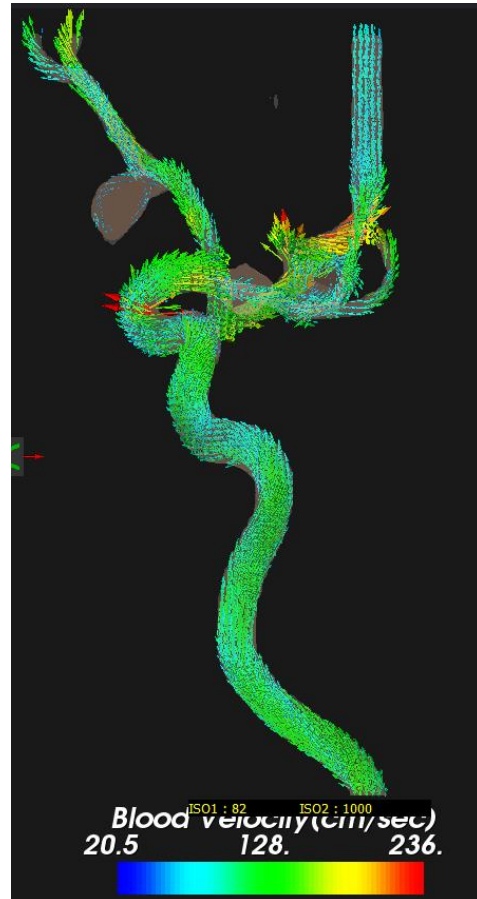
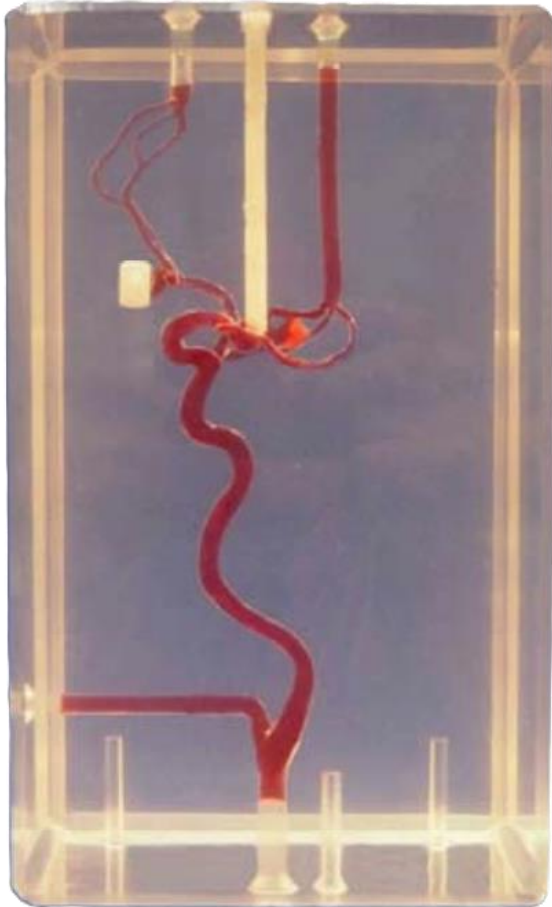






# Results

## MRI vs. CFD

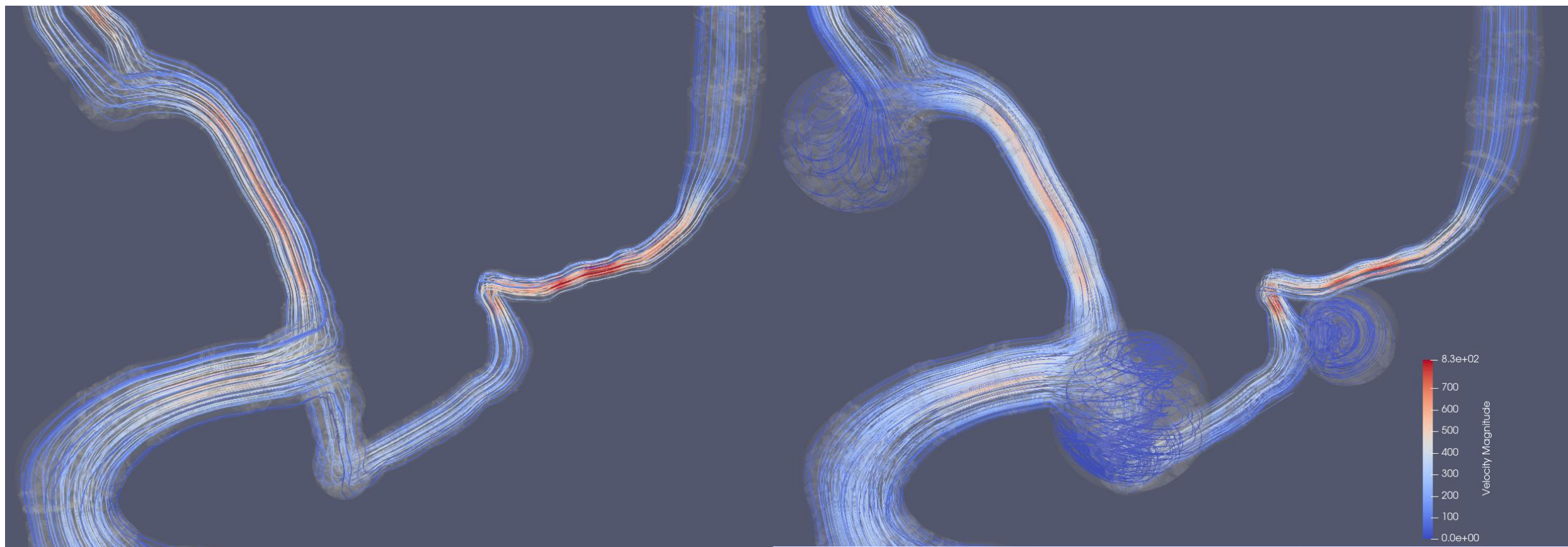


- **Global vessel geometry** is respected.
- **Tiny vessels**, not visible on MRI, are excluded from CFD computations.
- **Aneurysm geometry** is represented in a simplified form on the mesh.



# Results

With and without aneurysms

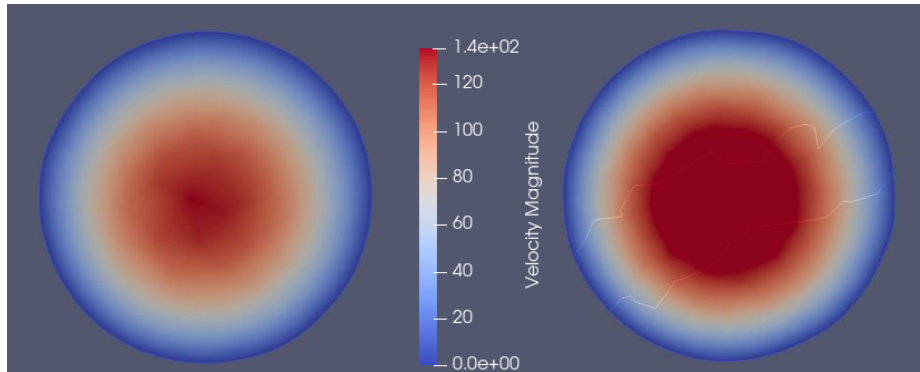




# Results

## Slices with and without aneurysms

1

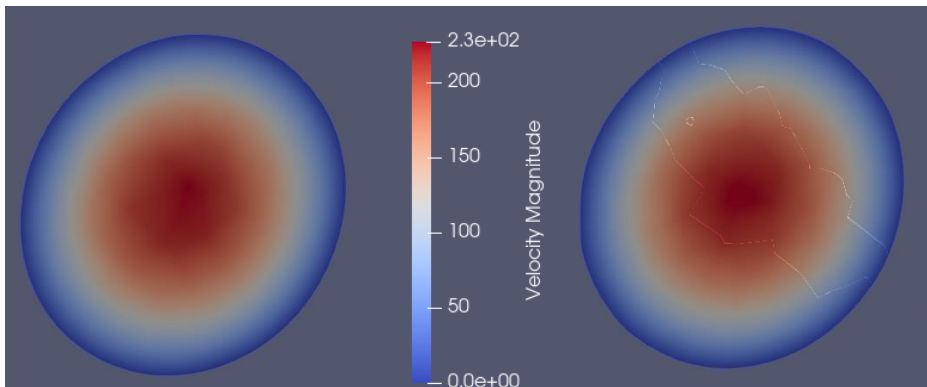


With aneurysm

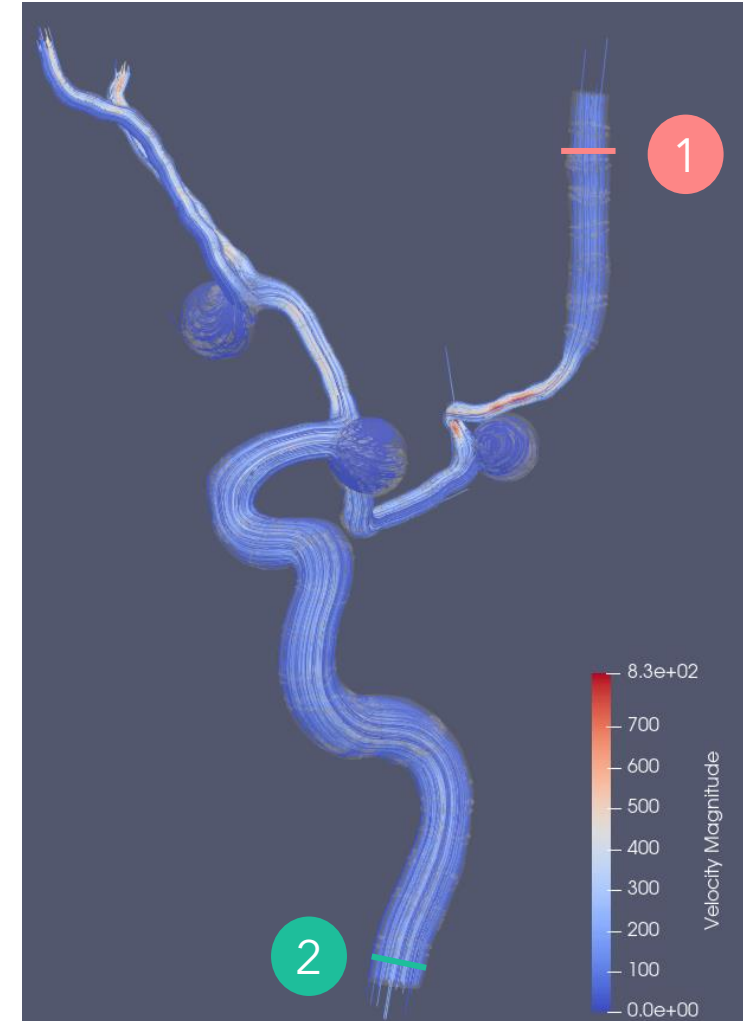
Without aneurysm

- Impact of the aneurysm: lower velocity at the outlet

2



- Same inlet (parameter)

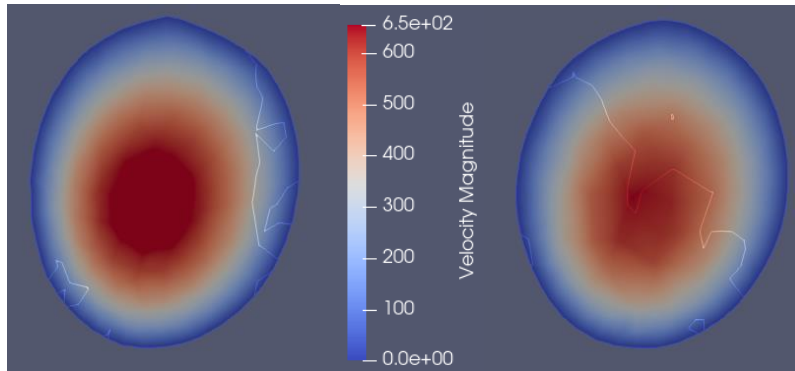




# Results

## Slices with and without aneurysms

3

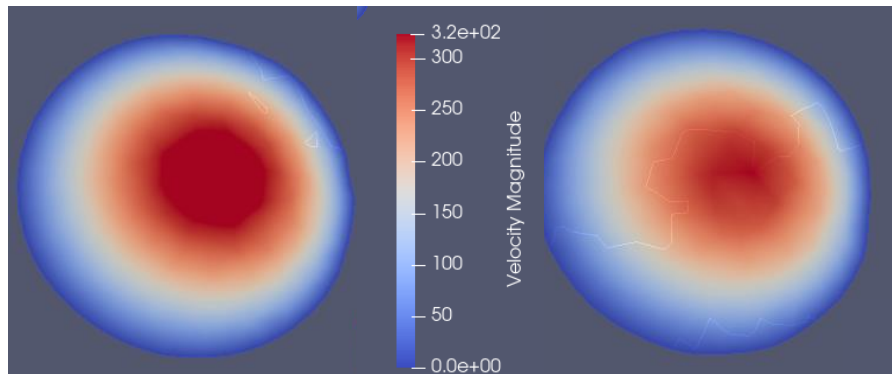


With aneurysm

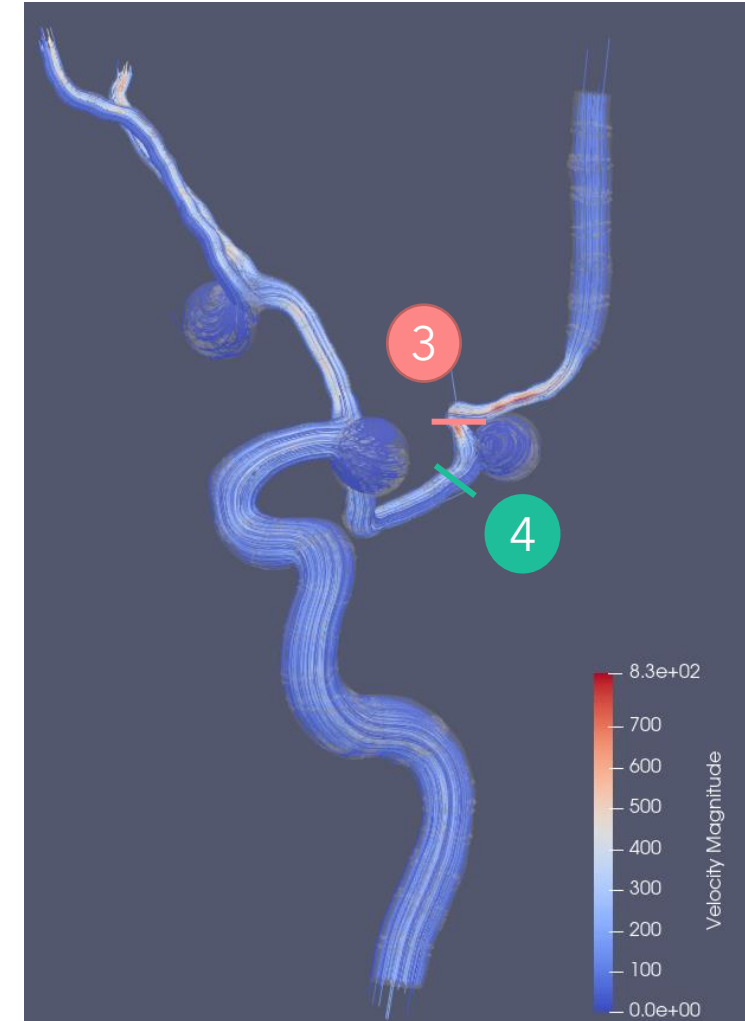
Without aneurysm

- Higher velocity right after the aneurysm (acceleration)

4



- Higher velocity right before the aneurysm (aspiration)

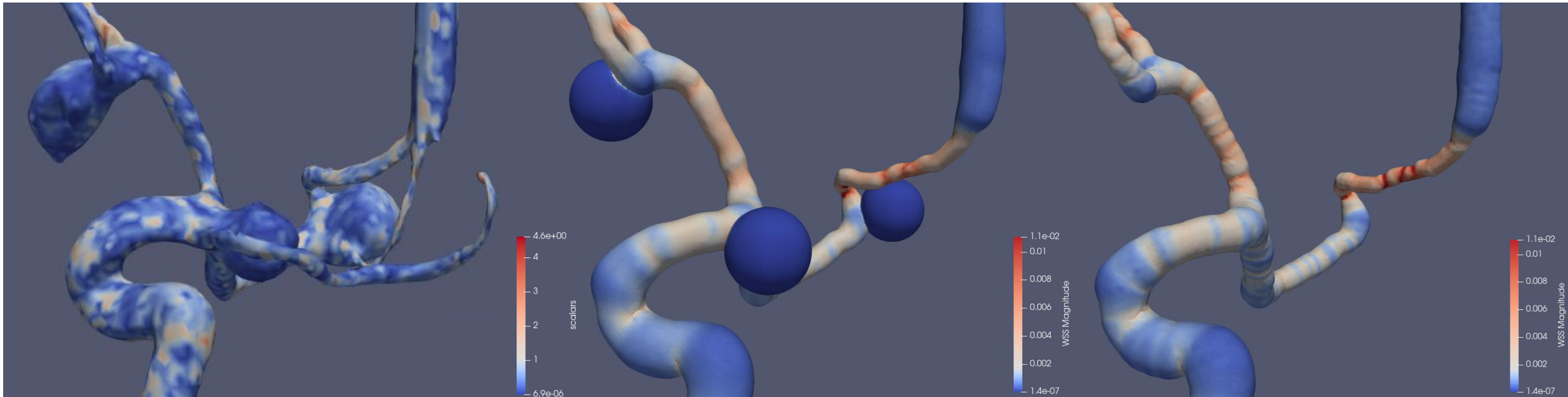






# Results

## Wall Shear Stress

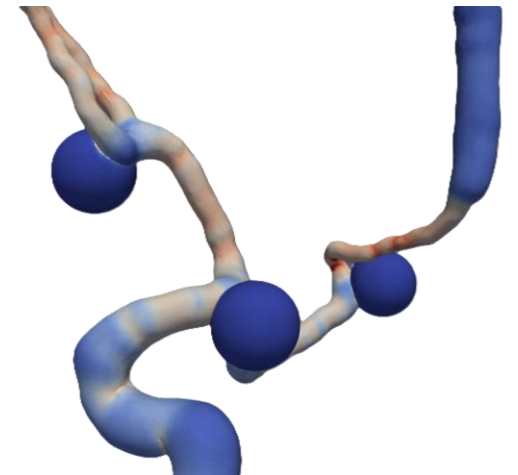
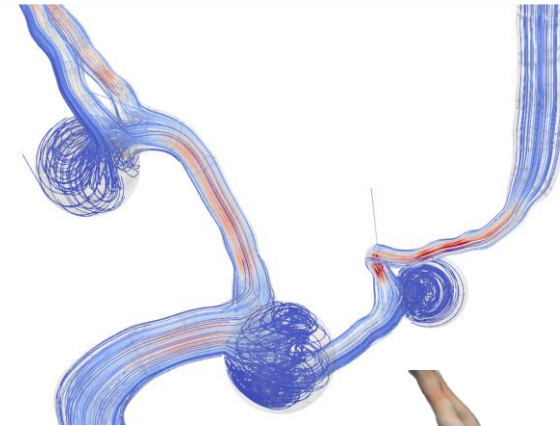
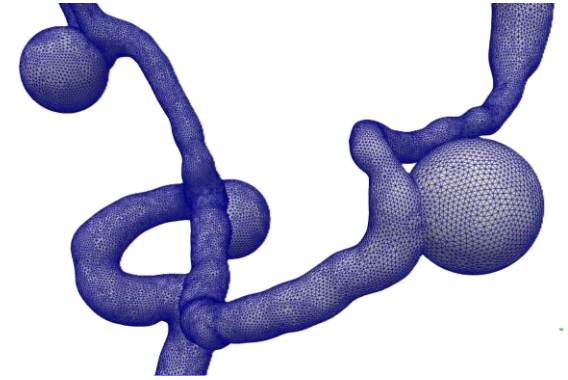
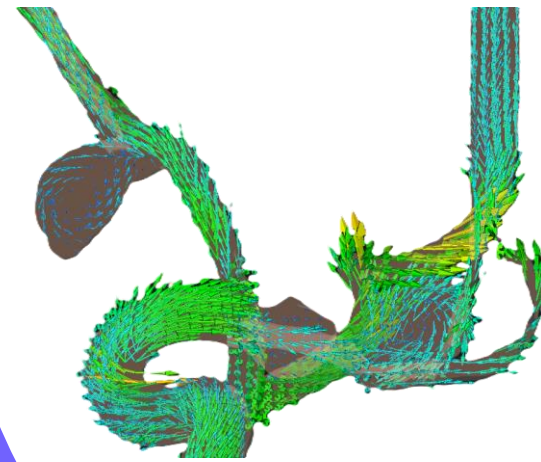


- **Scale-related challenges** affect the analysis.
- **Aneurysm regions exhibit near-zero WSS.**
- **MRI data is highly noisy**, impacting accuracy.



# Conclusions

- **Direct use of MRI images** to generate a mesh compatible with CFD simulations
- **Parallel fluid dynamics simulations** using dimensionless Stokes equations on a vascular phantom
- **Challenges identified:**
  - Wall shear stress (WSS) computations **not yet aligned** with MRI data
  - **Improved segmentation of the aneurysms** required for accurate analysis
  - **Need for comparison metrics** both in cross-sectional slices and across the entire volume



# Thank you for your attention!

## Any questions?



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