



# Understanding Cerebral Aneurysms through HPC-based Computational Modelling

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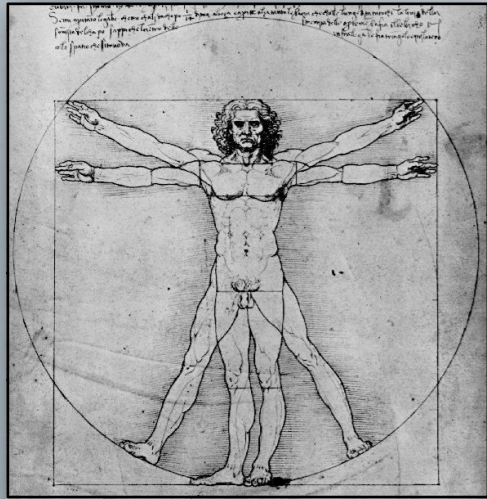
George Mason University  
USA

**Severo Ochoa Research  
Seminar Series**



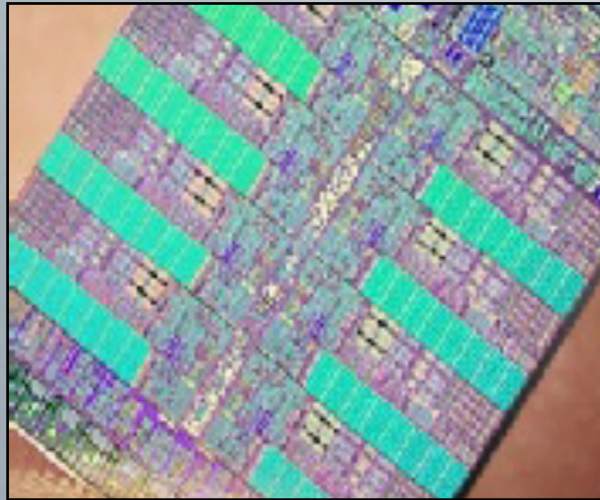
Barcelona Supercomputing Center





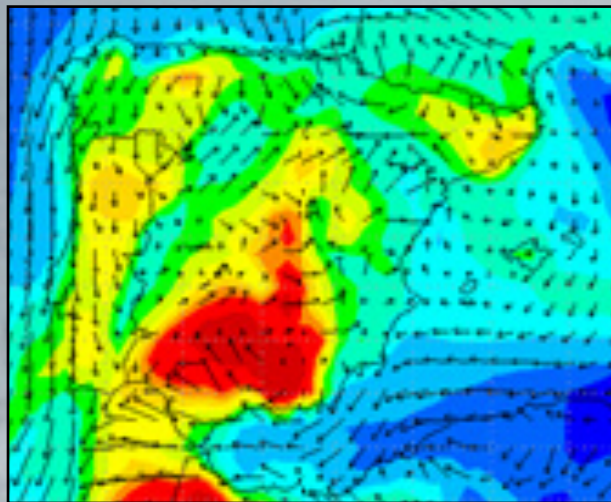
## BSC & HPC in Biomedical Research





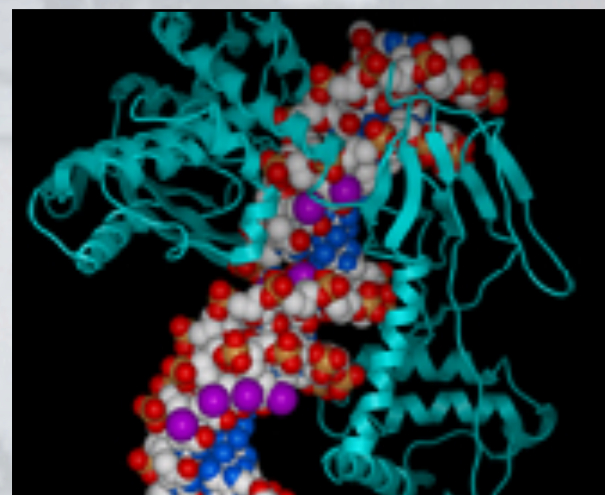
## Computer Science

Performance tools  
Computer architectures  
Programming models



## Earth Science

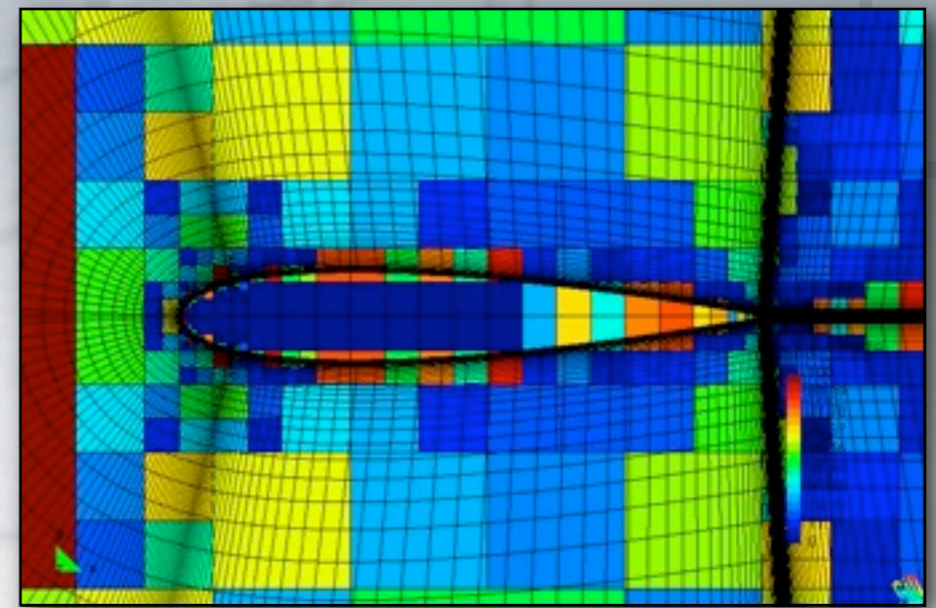
Air quality



## Life Science

Genomics  
Proteomics

Computer Applications in Science  
and Engineering  
CASE





Environment

Energy

Aerospace

Trains and Automotive

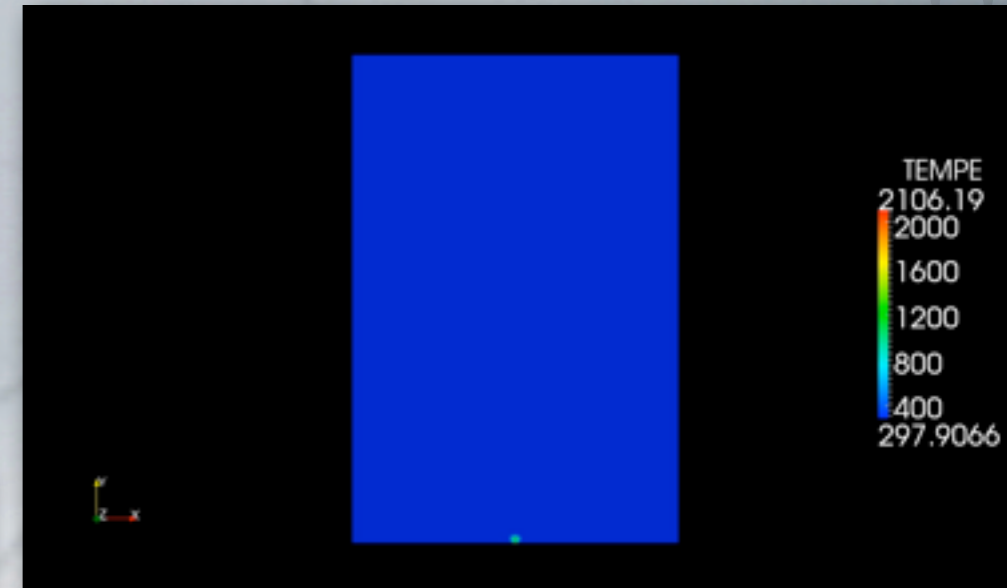
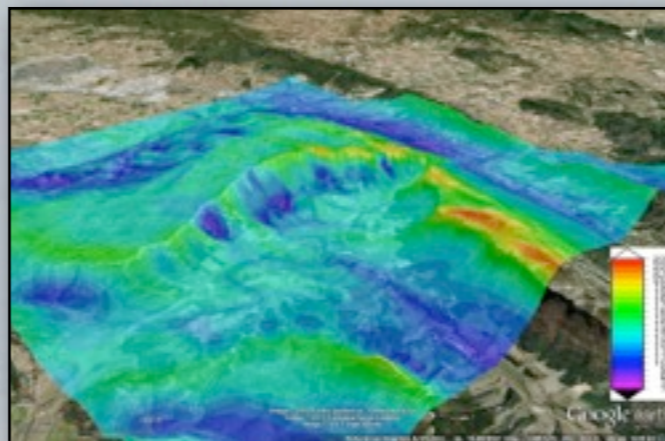
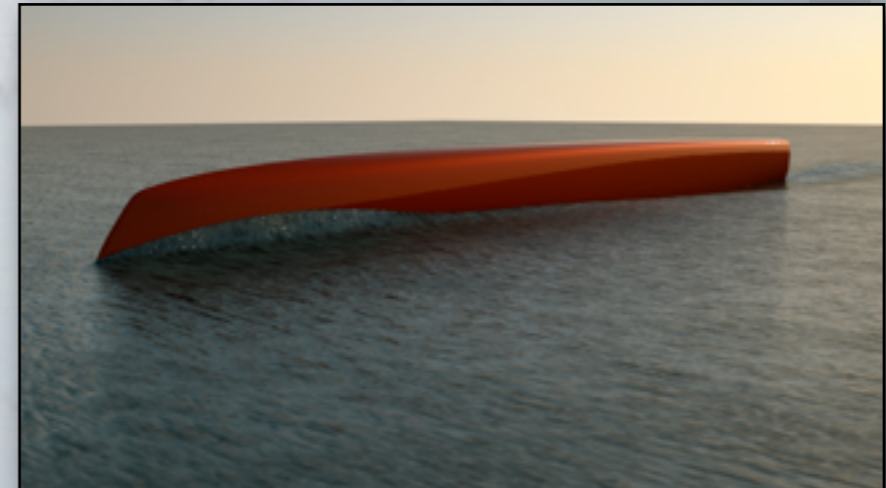
Oil and Gas

Artificial Societies

High Energy Physics

Materials Sciences

**Biomechanics**





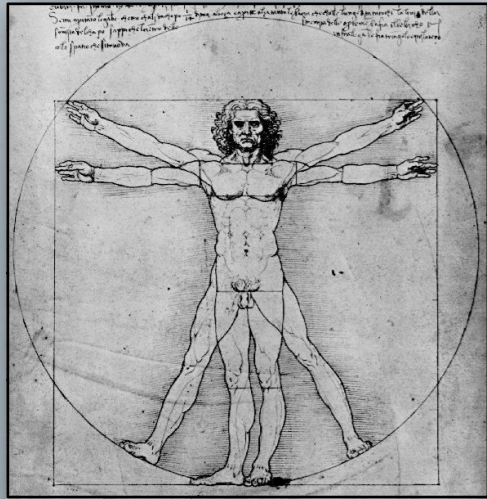
BSC-CNS is the only supercomputing center with +60 researchers devoted to **HPC-based Biomedical Research:**

Bioinformatics (45 Life Science Department)

Biomechanics (15 - 20 CASE Department)

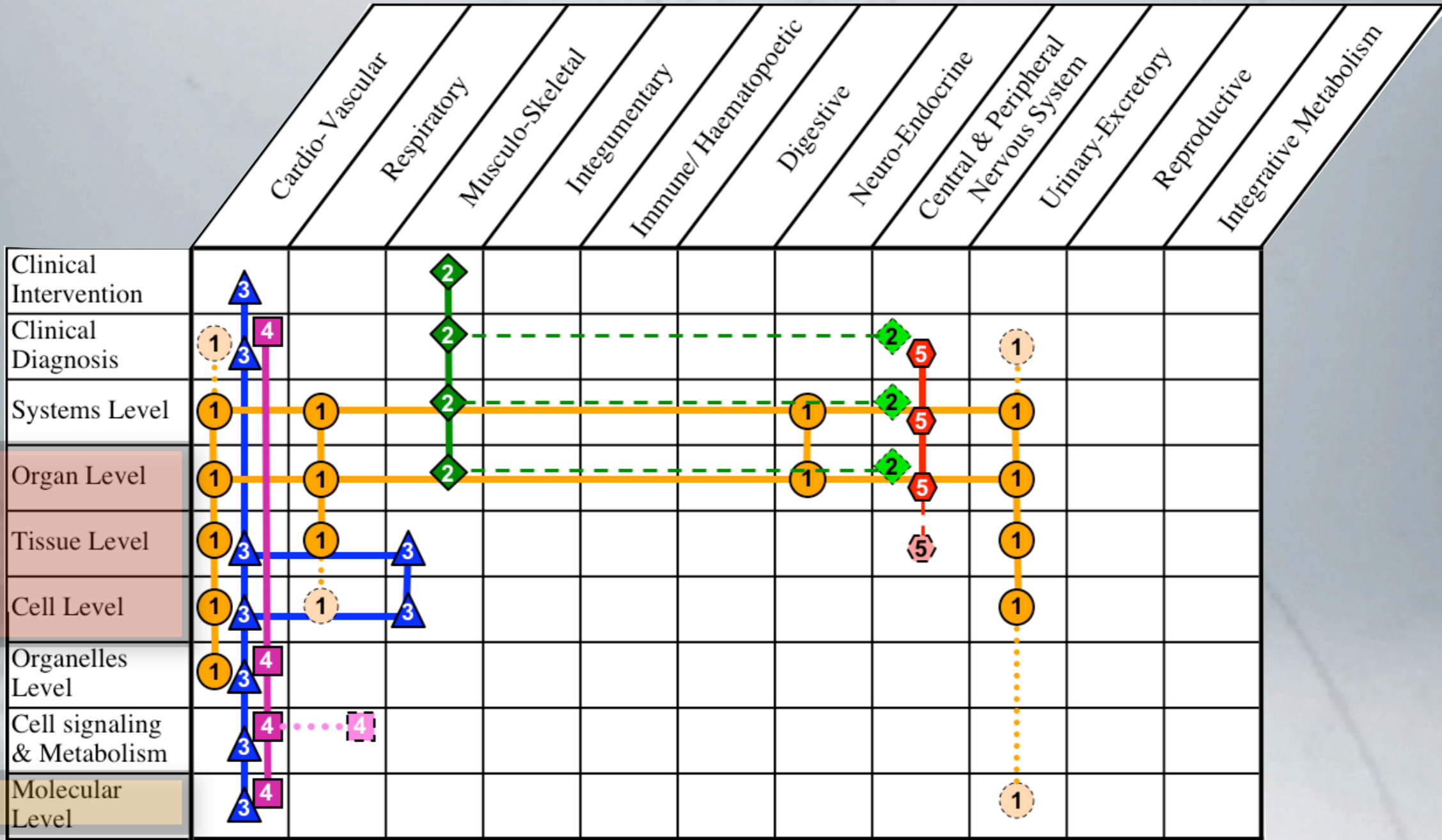






## Computational Biomechanics





Organ Systems vs. Levels of Organizations

Extracted from S.R. Thomas et al., VPH Exemplar Project Strategy Document.

Deliverable 9, VPH NoE. 2008



## Keywords

Drug action

Drug delivery

Treatment planning

Medical training

Design: prosthesis, stents, valves, bio-materials, experimental and manufacturing kits...

Study surgical procedures and treatments

...

## Targets

Biomedical research: know better and deeper, improve diagnose and treatment

Pharma industry: reduce time and costs of “from-design-to-market” cycle

Medical devices manufacturers: design better devices



## Medical doctors:

Healing is the final objective

Diagnose and treatment planning

Understanding biological systems

Physiological models

They provide the main motivation and insight to the problem



## Computational scientists:

Developing computational tools to run simulations

Provide the required simulation capacity

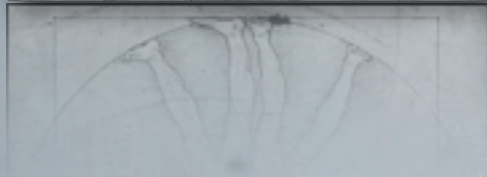
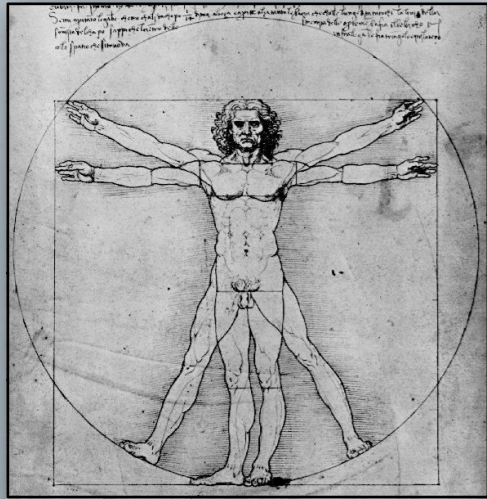


## Bio-engineers:

Develop the Physiological models  
Deal with medical image processing  
Design data acquisition tools







Alya Red  
HPC-based Biomechanical Simulations





# The Alya System

Multi-physics modular code for High Performance Computational Mechanics

Born in 2004

Designed from scratch to solve multiphysics problems with high parallel efficiency

Numerical solution of PDE's

Variational methods are preferred (FEM, FVM)

Hybrid meshes, non-conforming meshes

Explicit and Implicit formulations

Coupling between multi-physics (loose or strong)

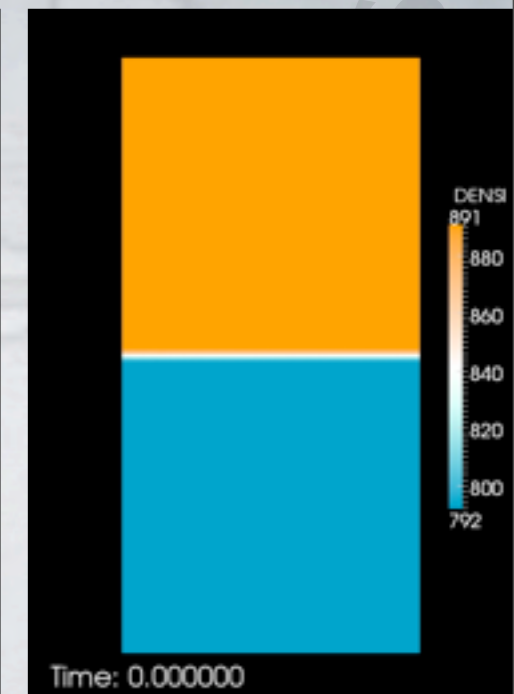
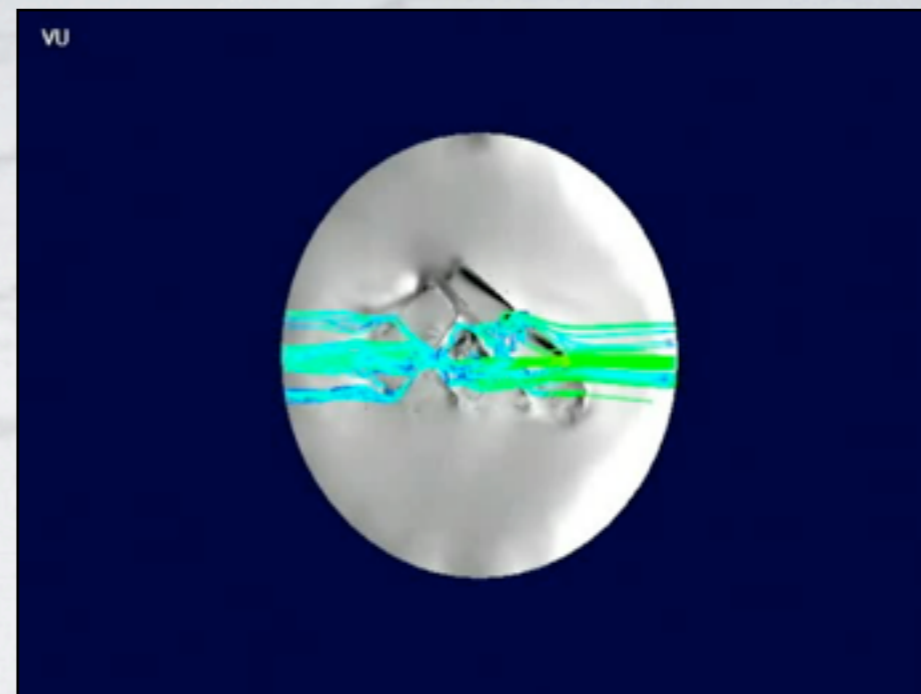
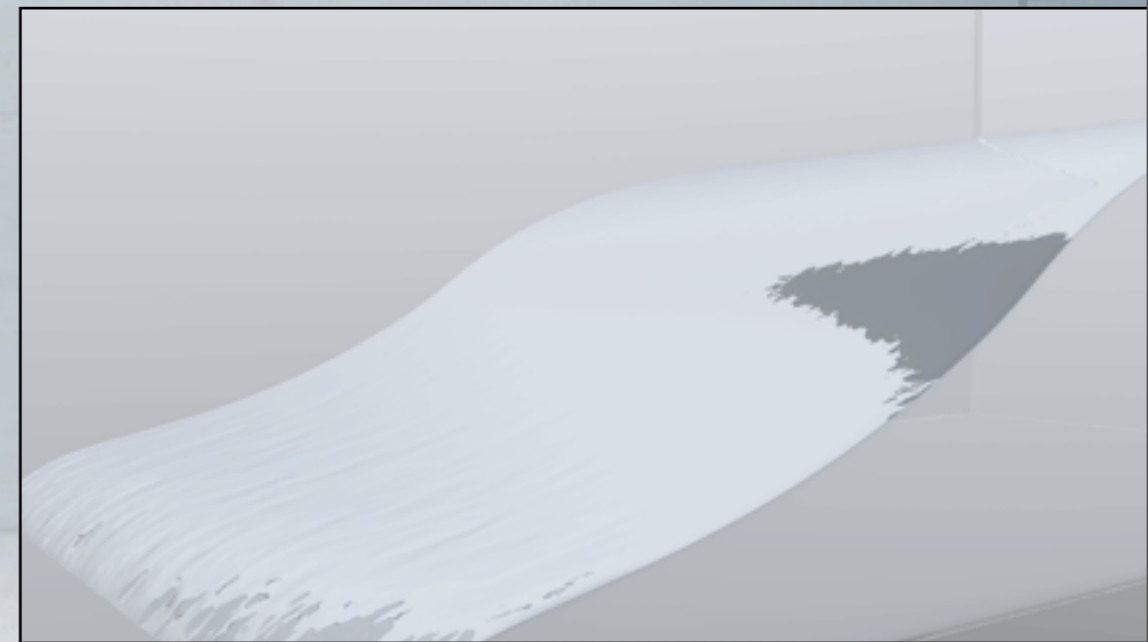
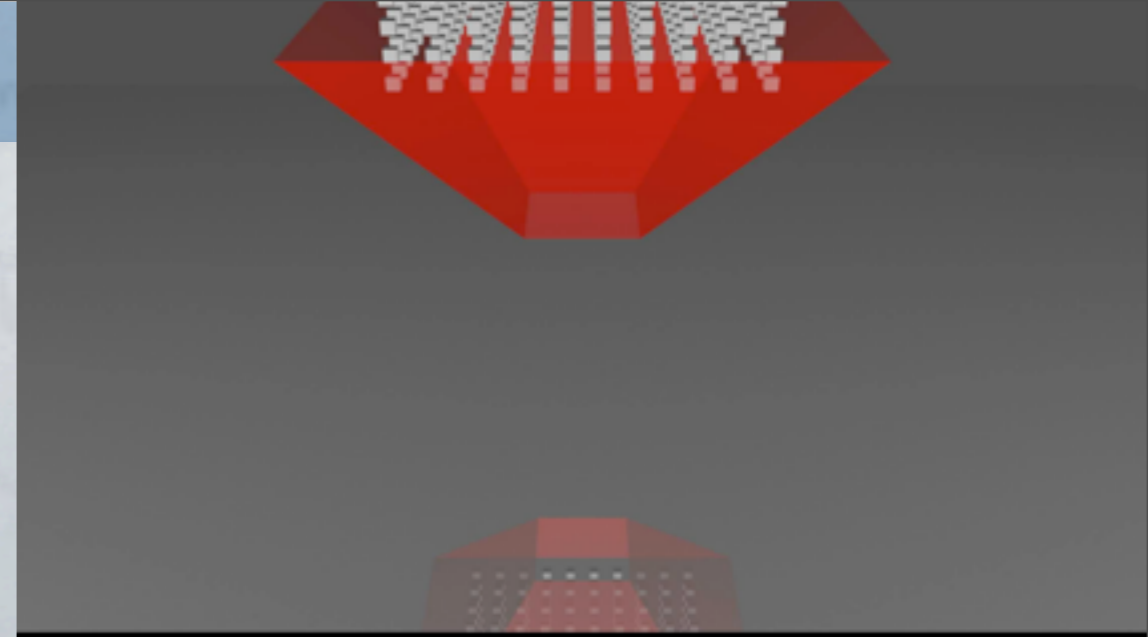
Advanced meshing issues

Parallelization by MPI and OpenMP

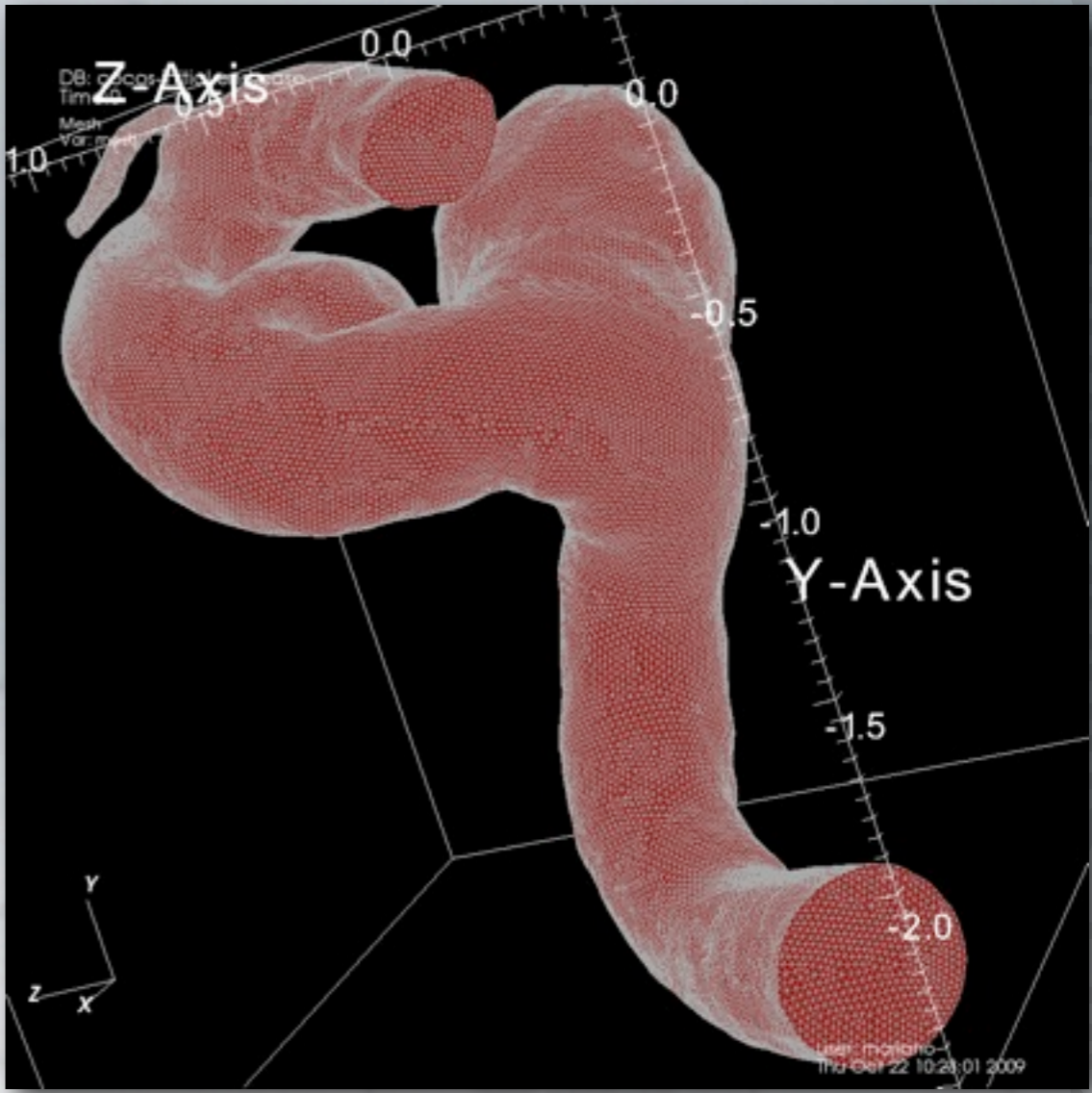
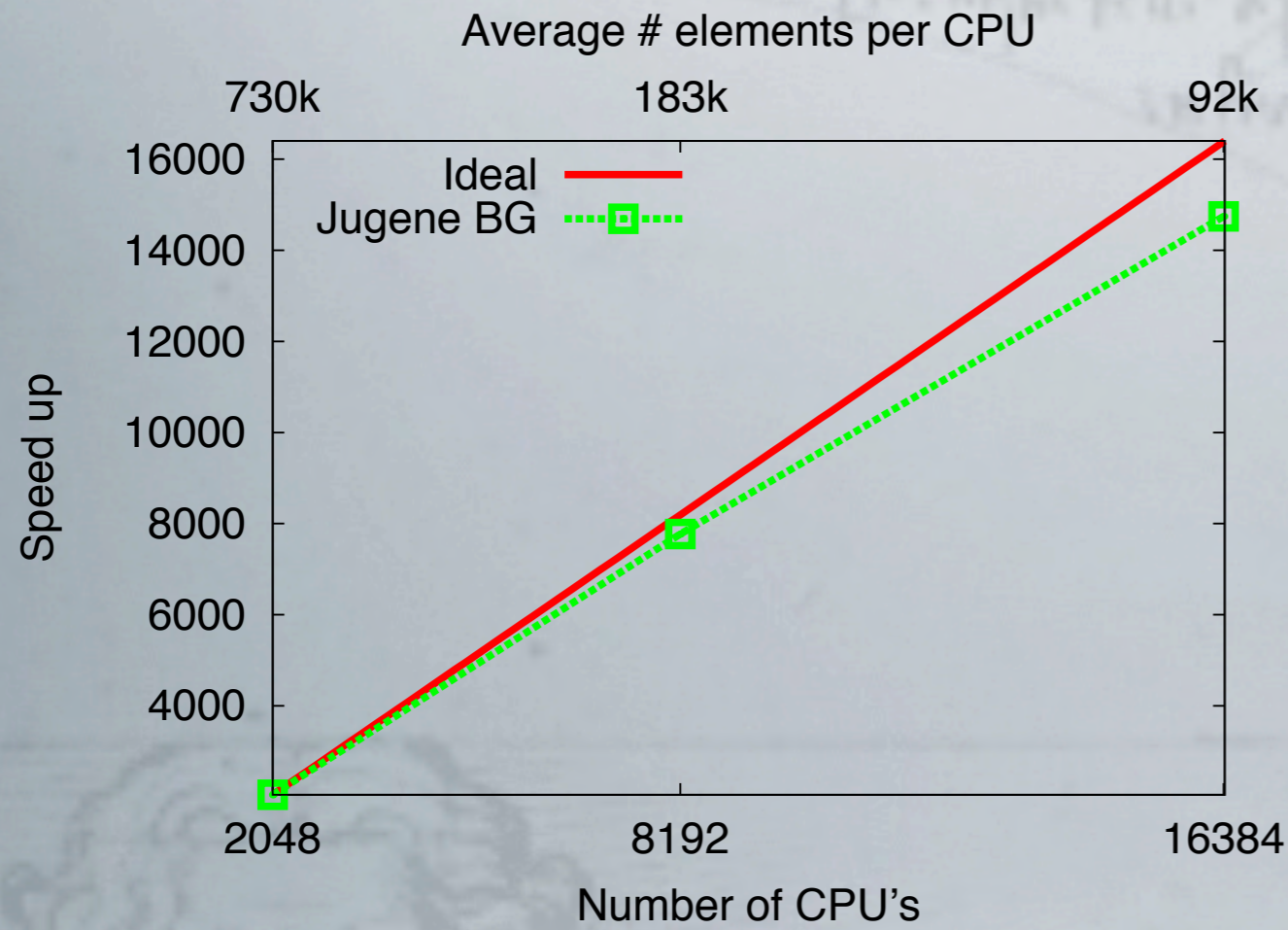
Automatic mesh partition using Metis

Portability is a must

Porting to new architectures: MICs, GPUs, ...







## Benchmark

Aneurism geometry provided by R. Cebral

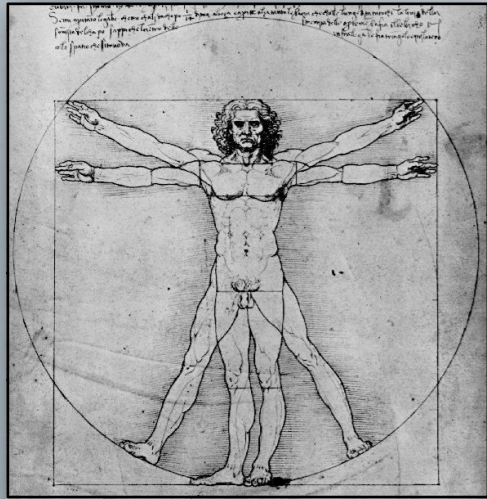
Uniform refinement up to 1.6B tetrahedra

Incompressible flow

Implicit formulation

Algebraic Fractional Step: BCGStab + Deflated CG





Alya Red

## HPC-based Biomechanical Simulations

Cardiac computational models

Respiratory system

**Cerebral aneurisms rupture risk**

Long skeletal muscles

Biomaterials and tissue engineering



# Cerebral Aneurysms

High prevalence

Devastating consequences

Low risk if not treated...

... but treatment carries risk

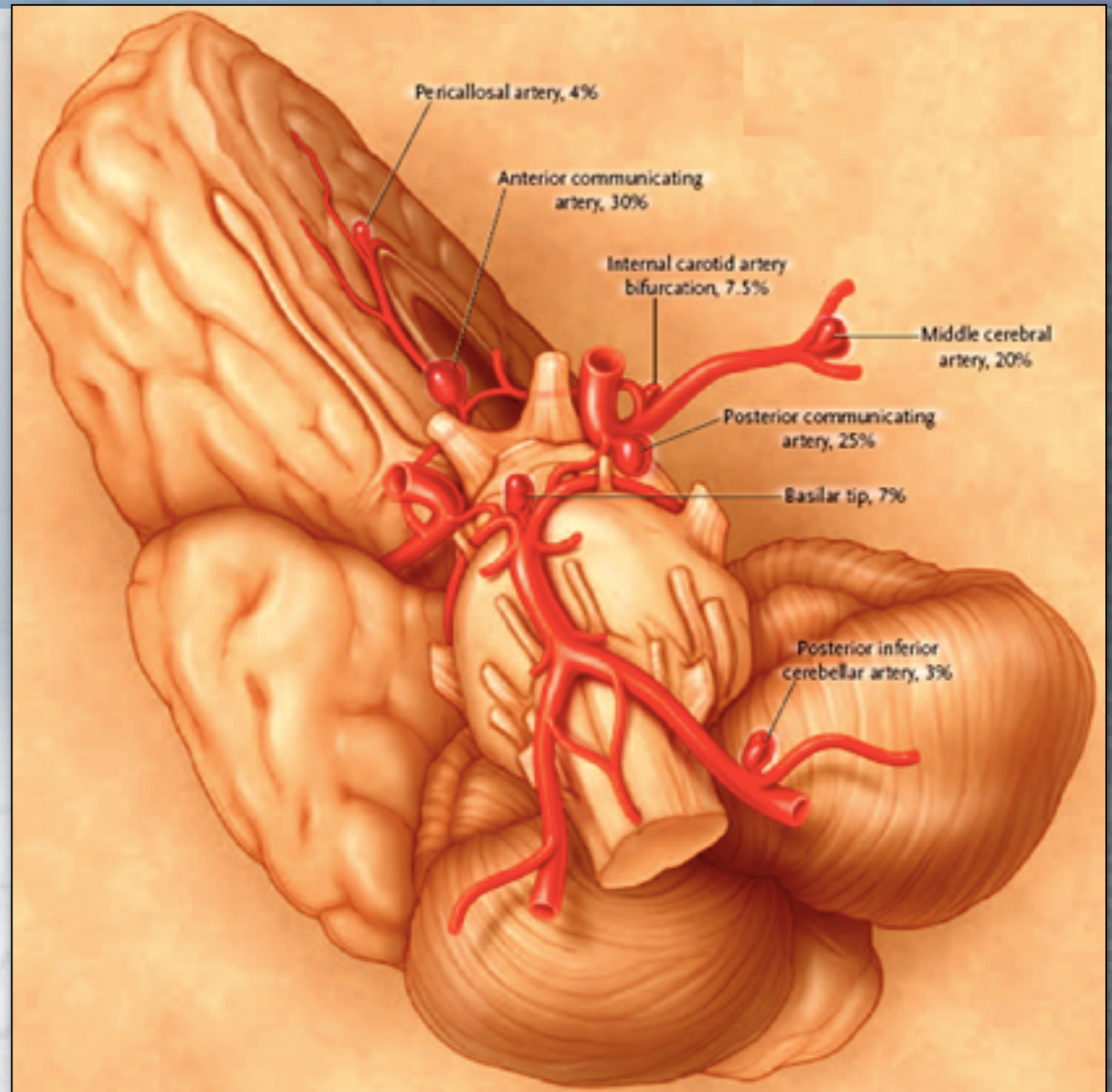
Incidentally detected

5% have aneurysms but

0.1% will broke

50% of the broken cause death

60% of survivors suffer strong impairment





# Cerebral Aneurysms

High prevalence

Devastating consequences

Low risk if not treated...

... but treatment carries risk

Incidentally detected

... then, **treat or observe?**

**Observe:**

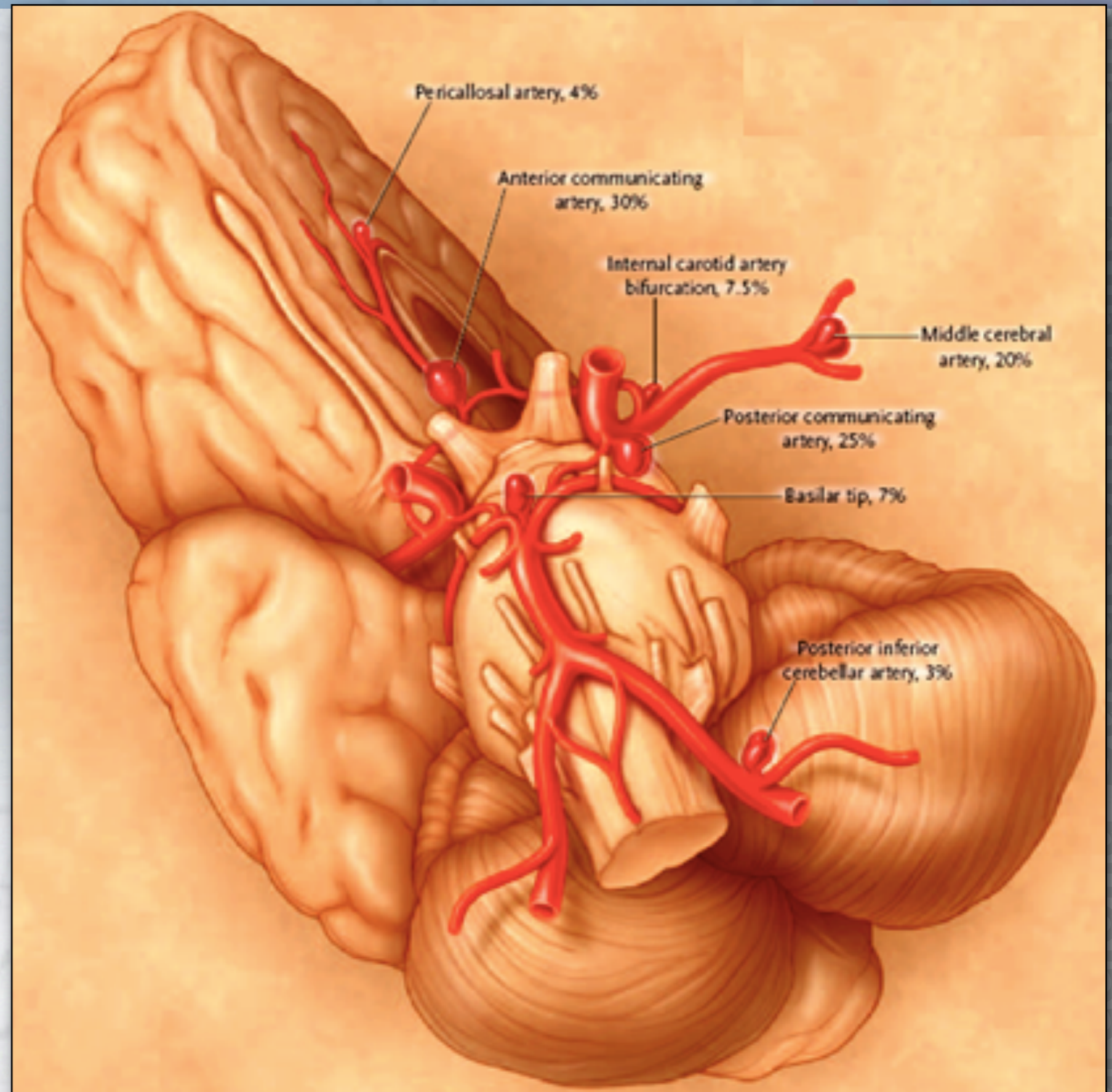
How often?

How to lower risk factors?

**Treat:**

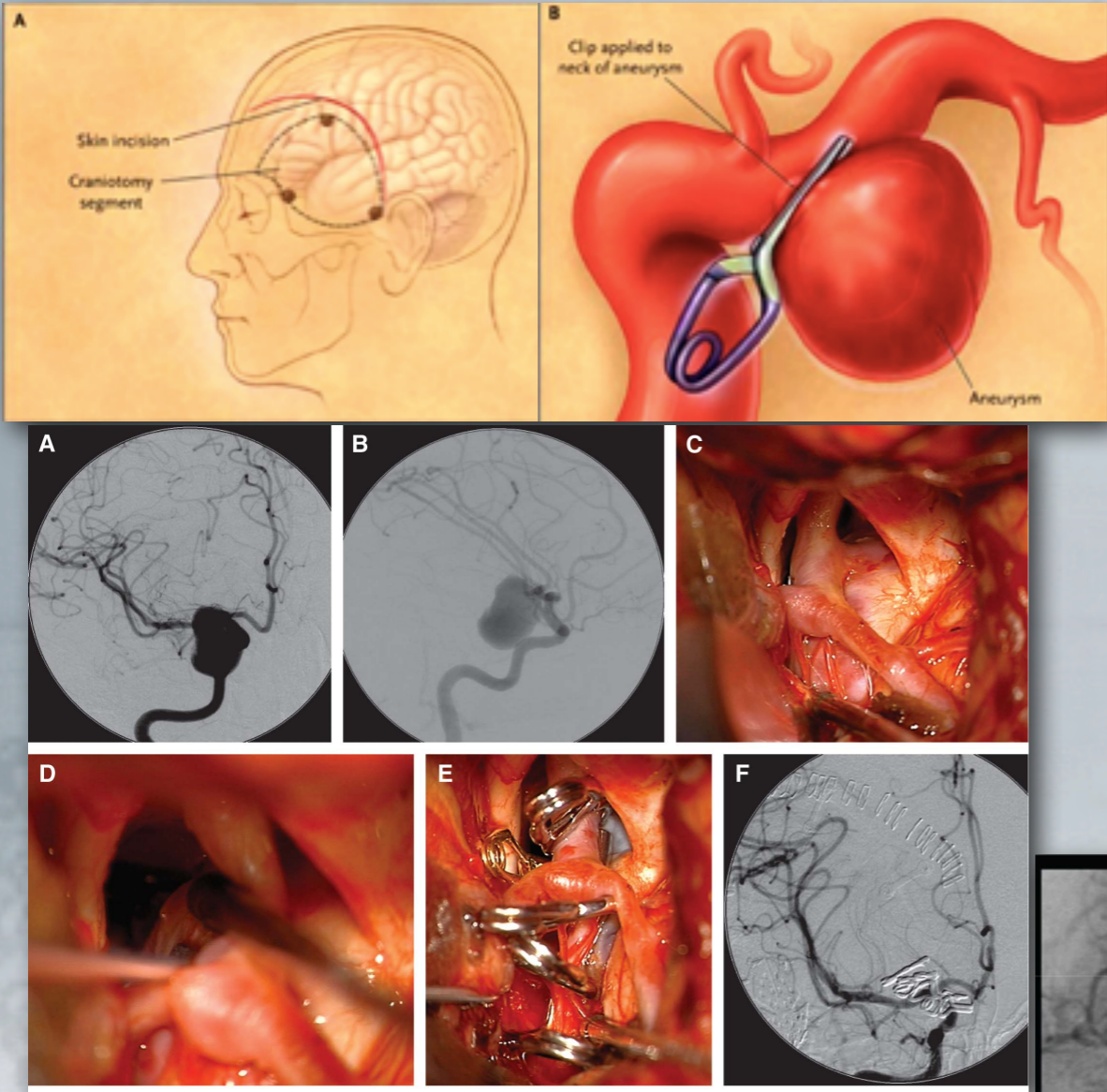
Surgically or endovascularly?

Which device?

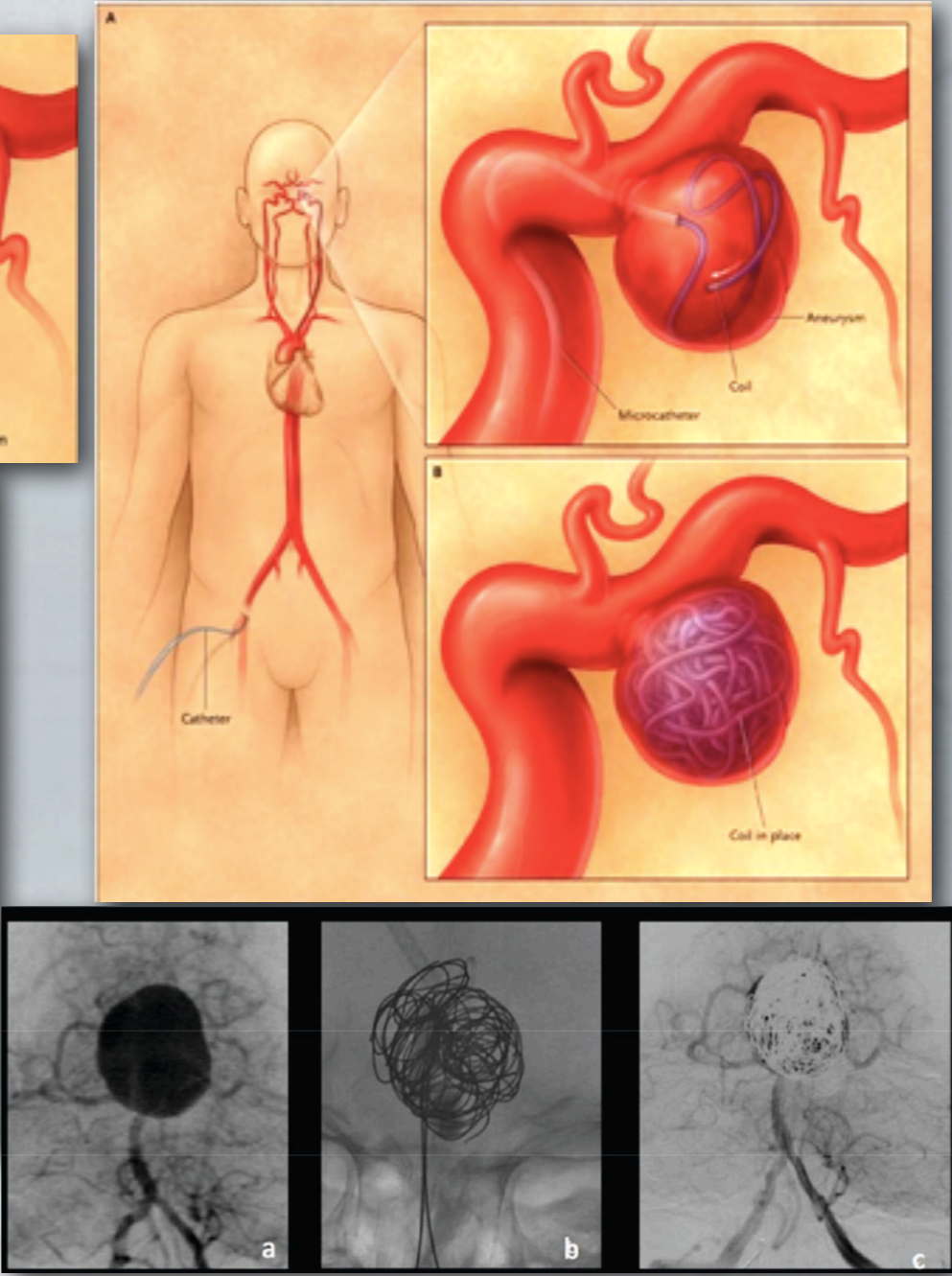




## Surgical



## Endovascular



Guide of Practice:  
Treatment for all larger than 1cm  
But most of the broken ones are smaller than 0.7cm!



## Risk Factors

### Anatomical factors

Size

Irregular shape

Location:

Posterior circulation

Communicating arteries

Circle of Willis

### Clinical factors

Previous SAH

Smoking

Female gender (2/3 are women)

Hypertension

Co-morbidities

Age

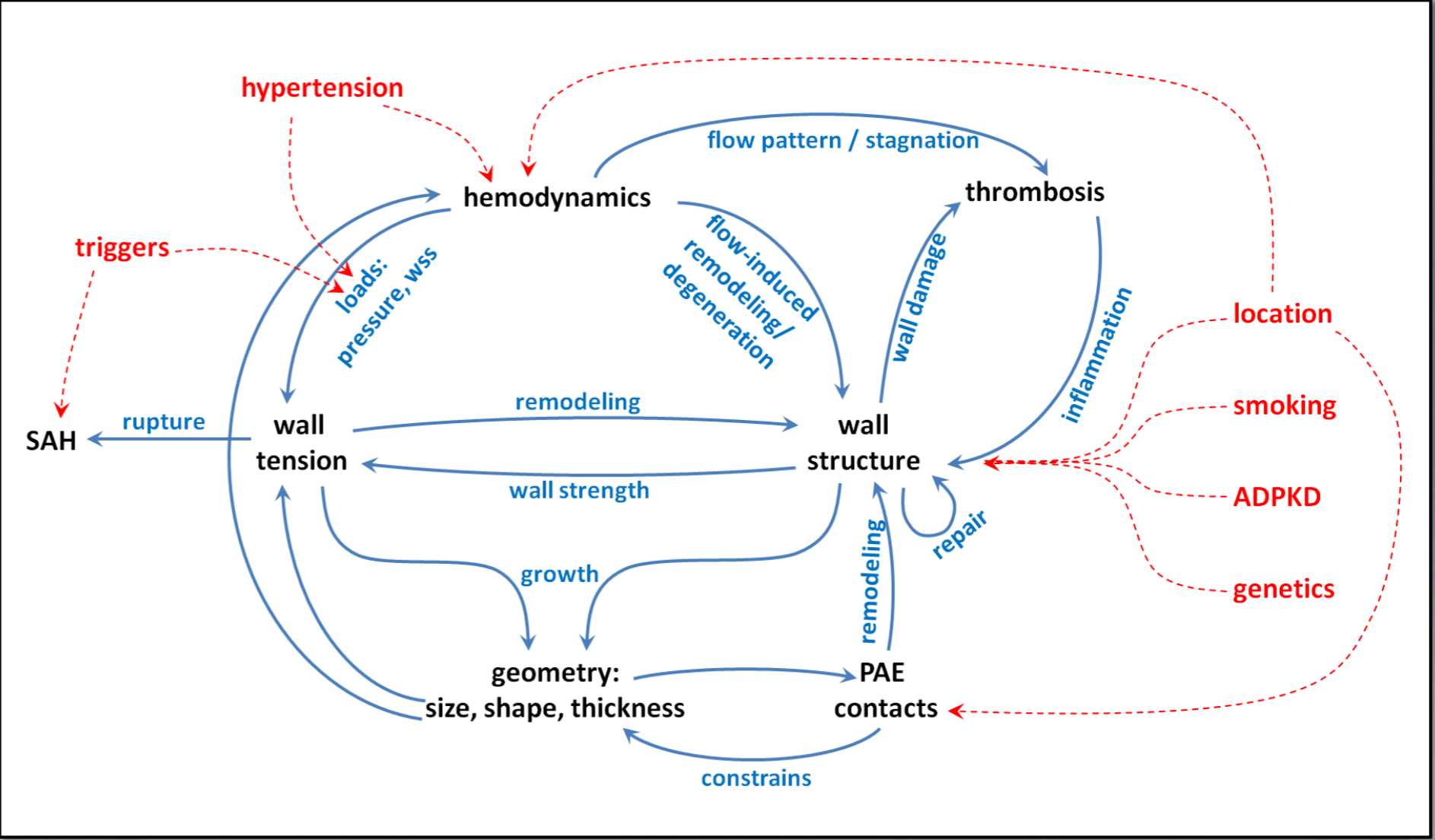
Activity

Genetics



## Risk Factors and Mechanisms

Cebral JR, Raschi M, "Suggested connections between risk factors of intracranial aneurysms: a review", Annals of Biomedical Engineering, 41(7): 1366-1383, 2013



**Abnormal flow** => wall biology => wall deteriorates

Weakening, expansion and geometry change

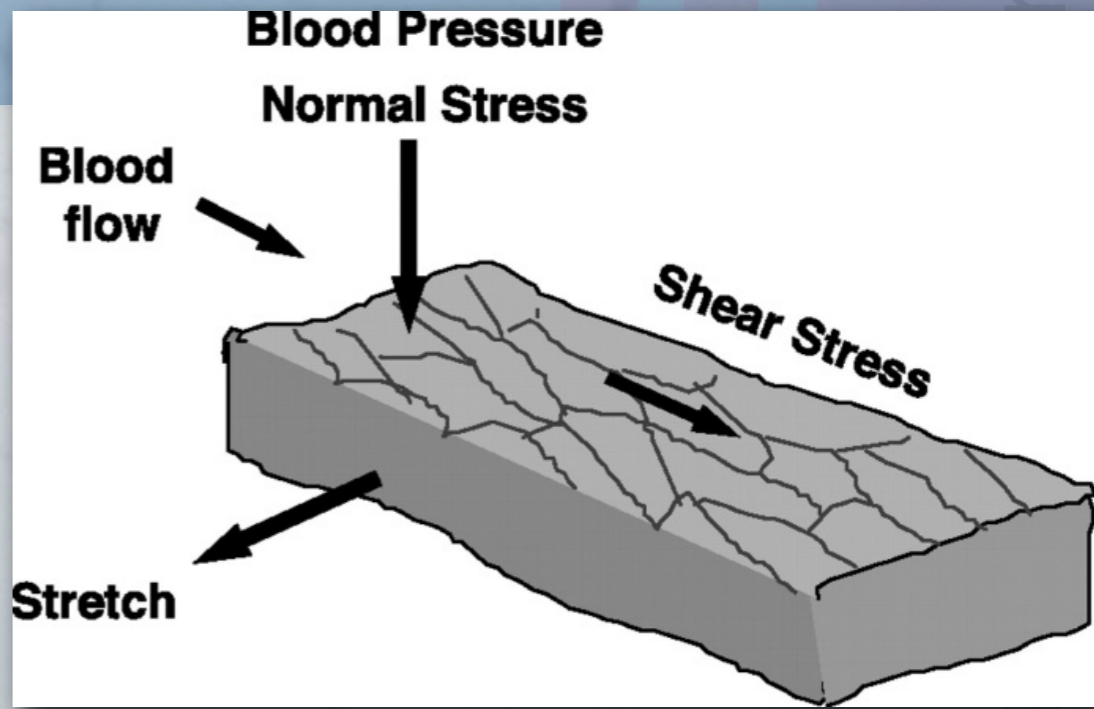
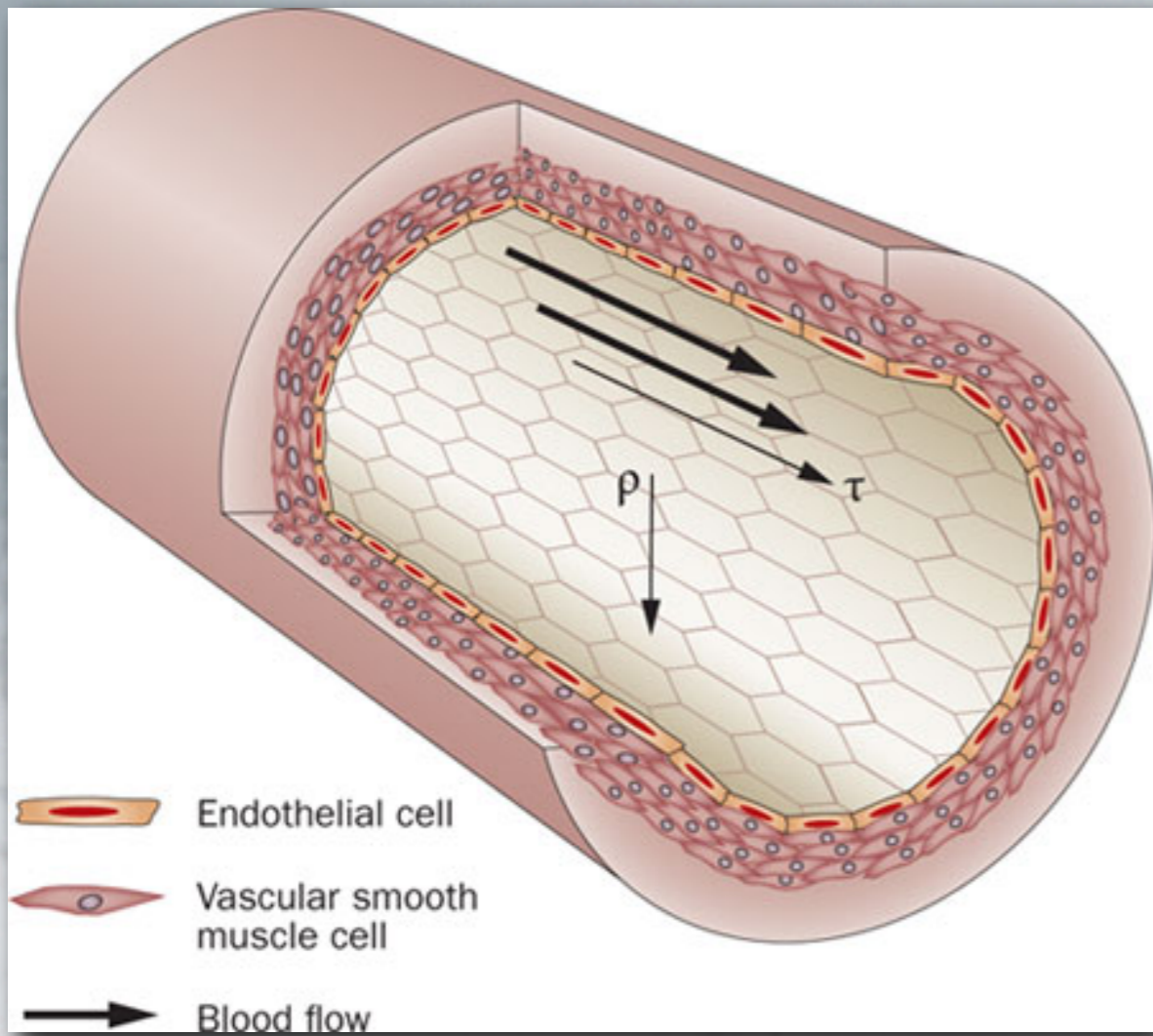


# Cerebral Aneurysms

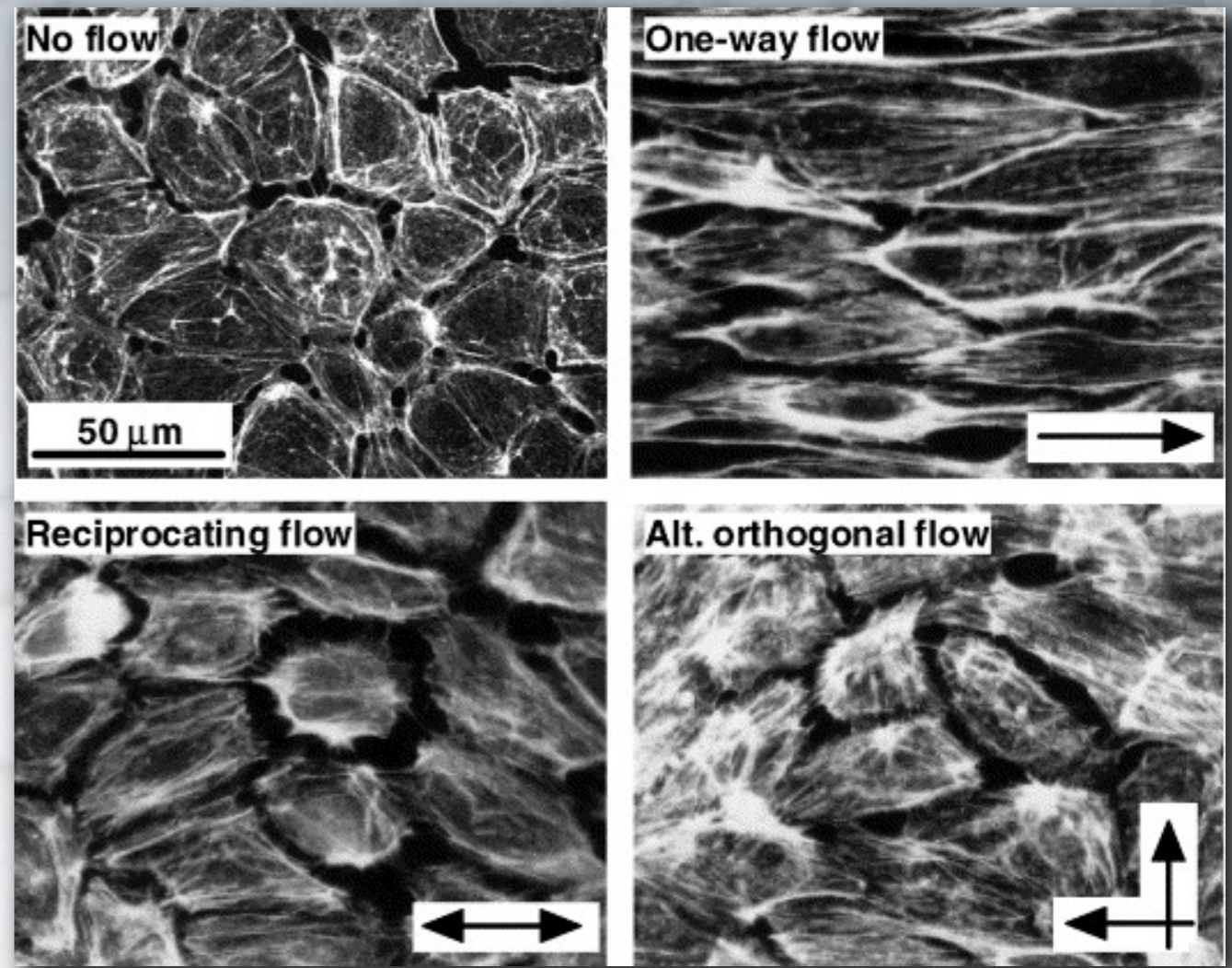
## Mechano-biology

Wall shear stress (wss) determines endothelial growth

## Vessel wall and blood flow

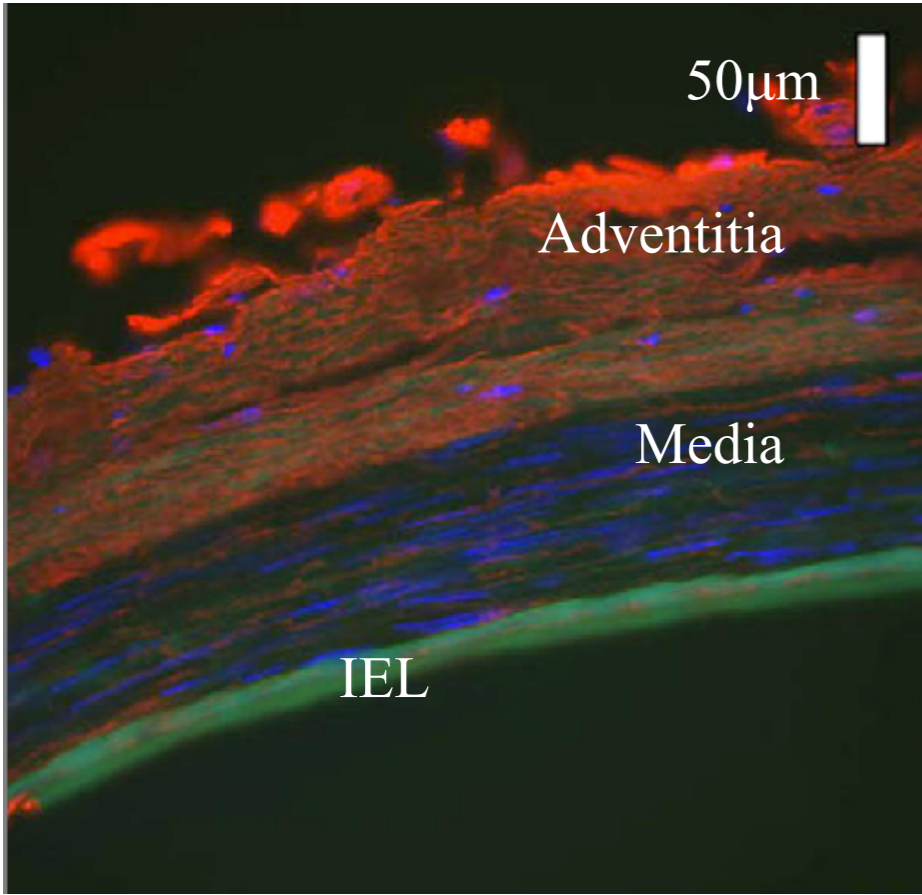


## EC sensing and response to WSS





Human Cerebral Artery (basilar)  
(confocal microscopy)

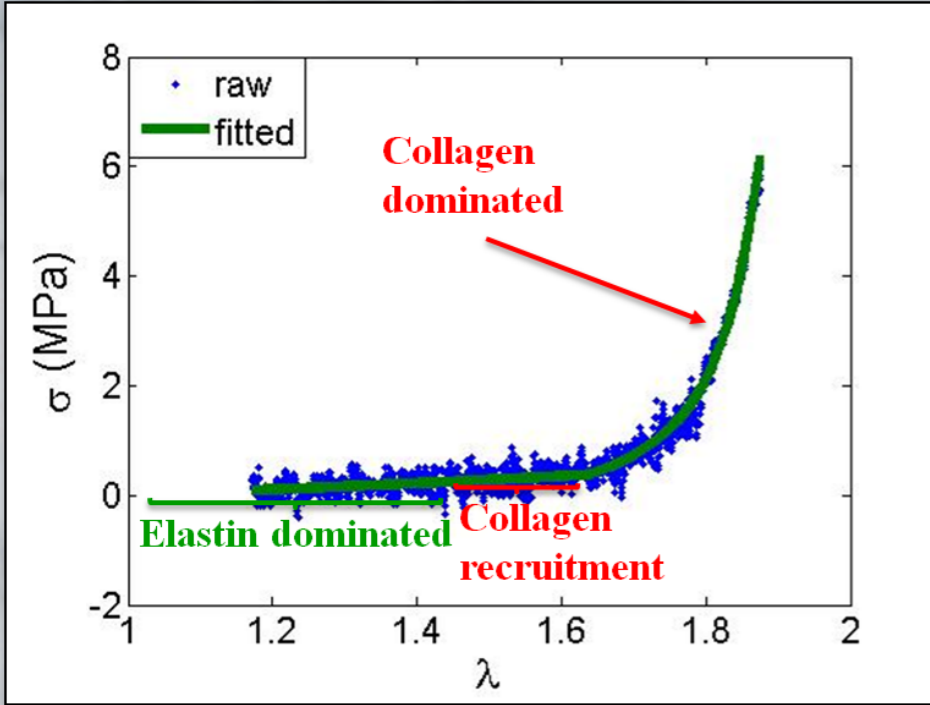


Wall Structure

Adventitia: collagen fiber bundles

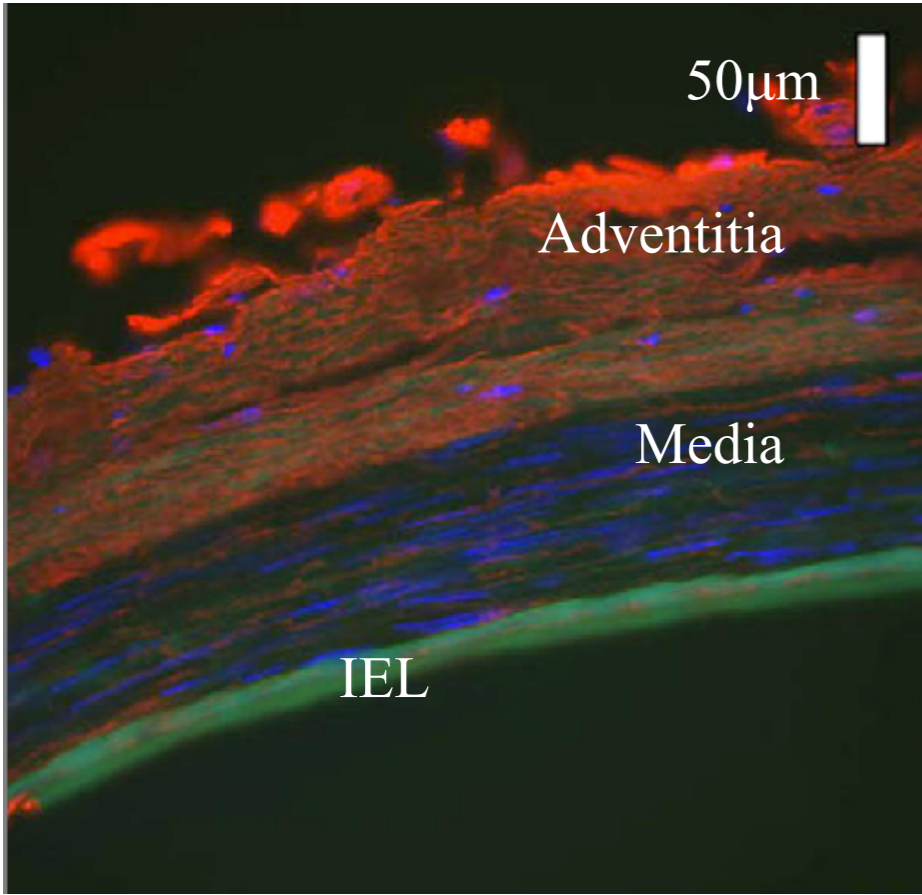
Media: collagen and collagen producing cells

Internal elastic lamina IEL: elastin





## Human Cerebral Artery (basilar) (confocal microscopy)



## Wall Structure

Adventitia: collagen fiber bundles

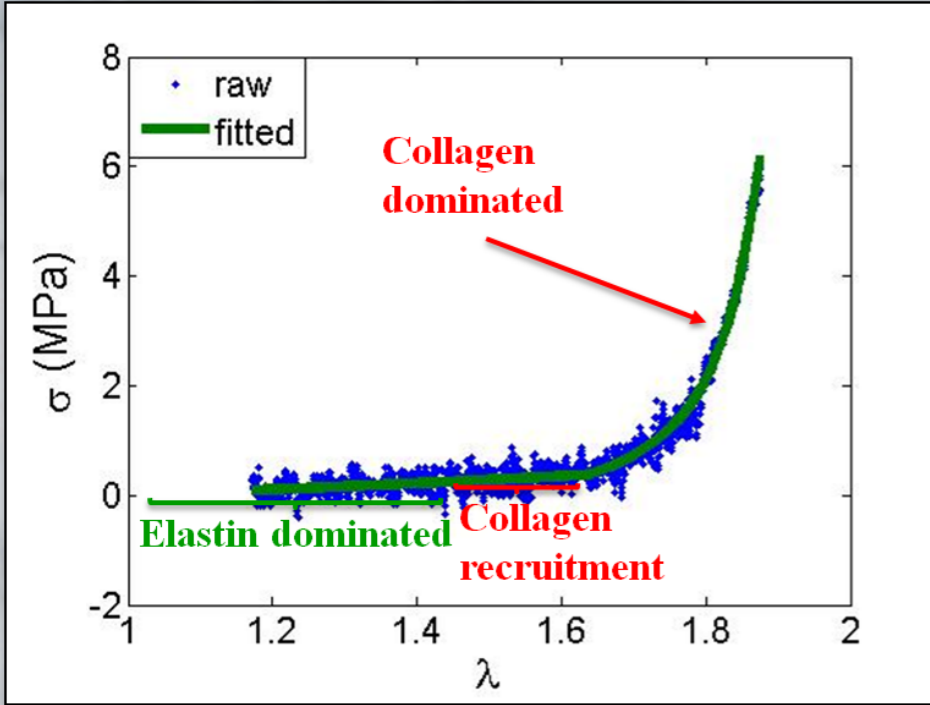
Media: collagen and collagen producing cells

Internal elastic lamina IEL: elastin

Adventitia: collagen fiber bundles

Media: **damaged, stop producing collagen**

Internal elastic lamina IEL: **disappears in aneurysms**





## Pathobiologic responses to abnormal behavior

Two different ones:

### High Wall Shear Stress

EC damage or weakening

MPP production by mural cells

ECM degradation

Medial thinning

Mural cell apoptosis

### Low Wall Shear Stress

Proinflammatory EC are “leaky”

Inflammatory cell infiltration

MPP production by macrophages

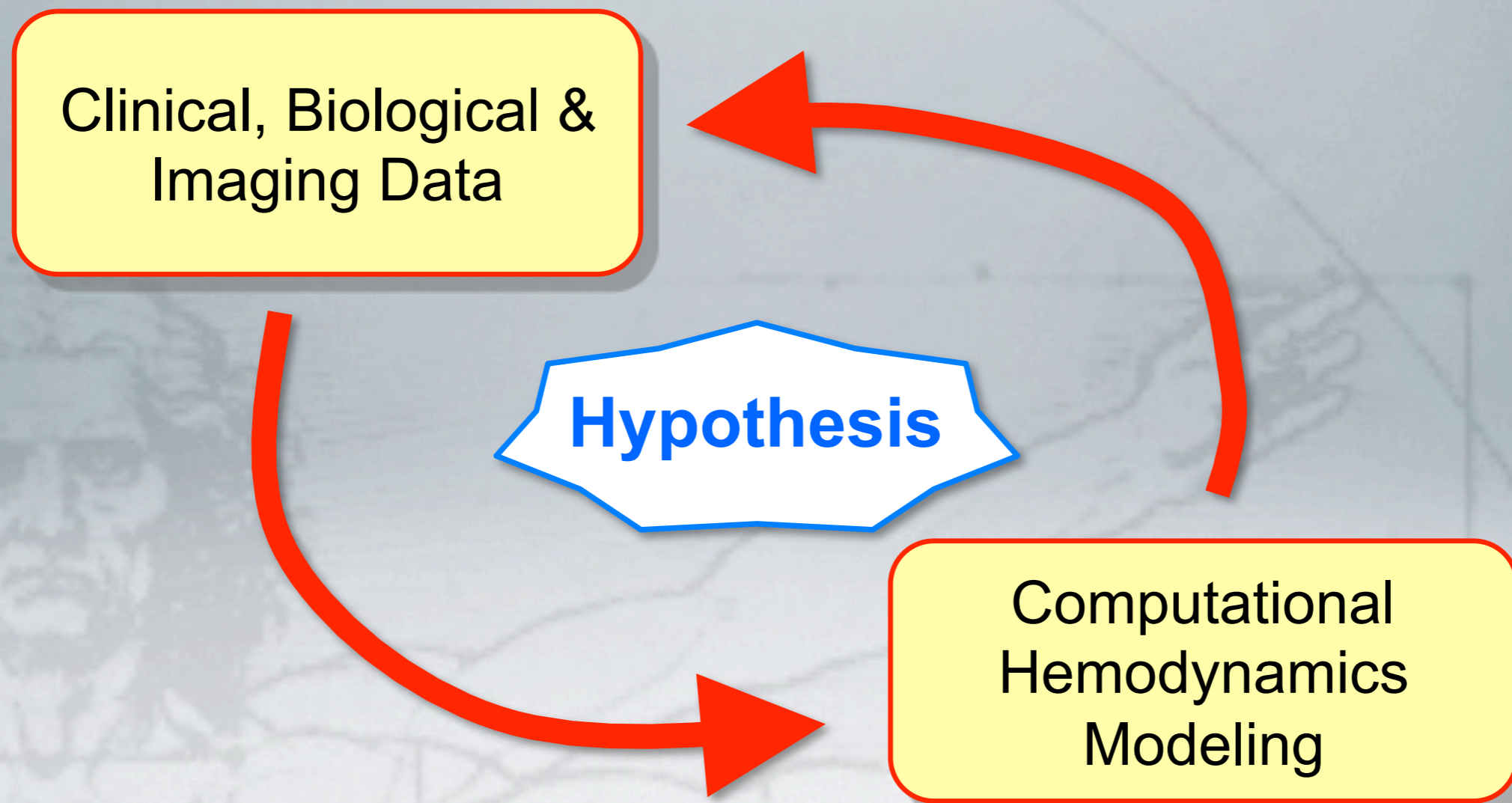
SMC proliferation and migration

Thrombus formation

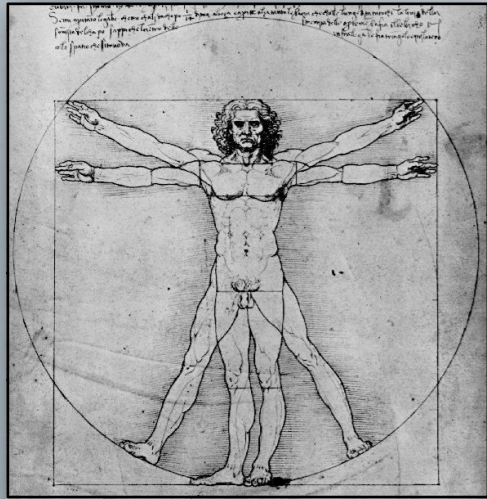
**Which is the right one?**



Cebral JR, Putman CM, "Relating Cerebral Aneurysm Hemodynamics and Clinical Events", in Vascular Hemodynamics: Bioengineering and Clinical Perspectives. P. Yim (ed.), John Wiley & Sons, Chapter 3, pages: 346, ISBN-13: 9780470089477, 2008







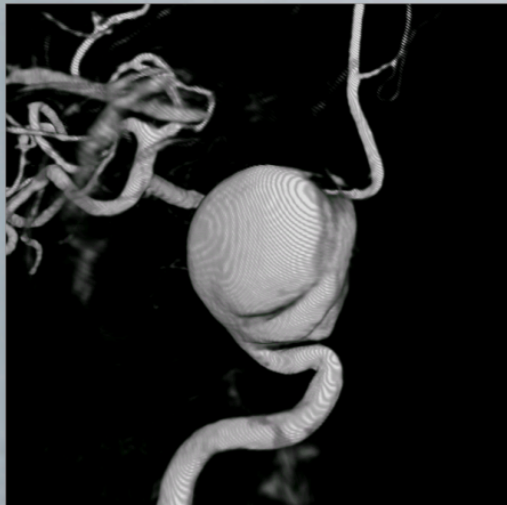
## Image based hemodynamics modeling





# Image based hemodynamics modeling

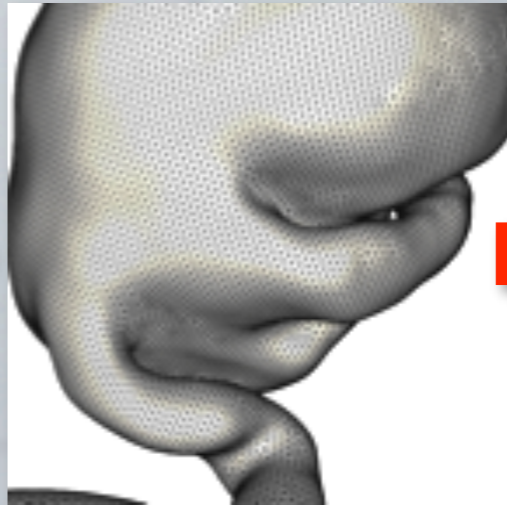
imaging



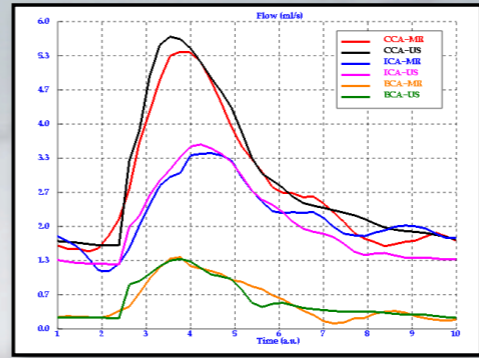
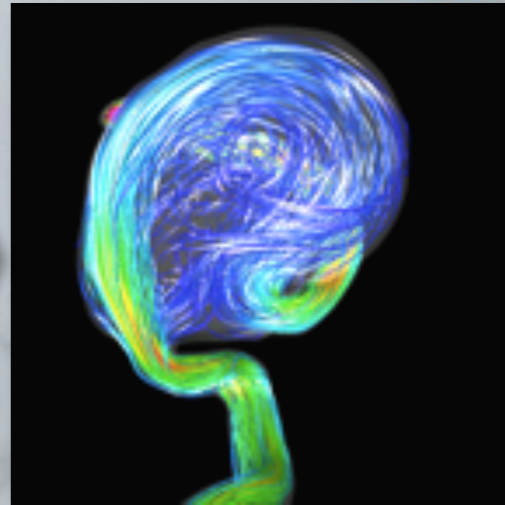
geometry modeling



meshing



flow visualization



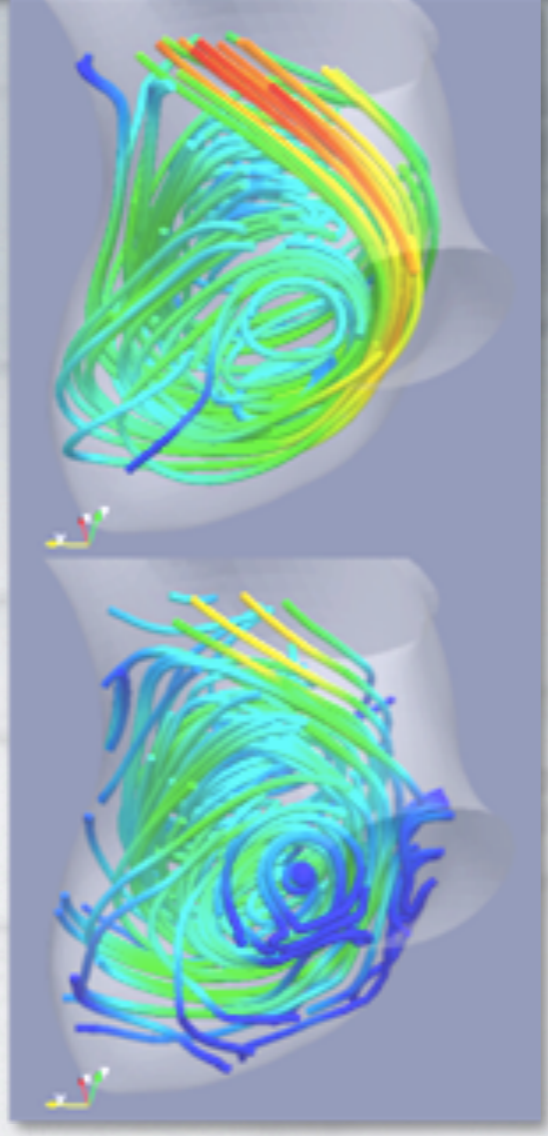
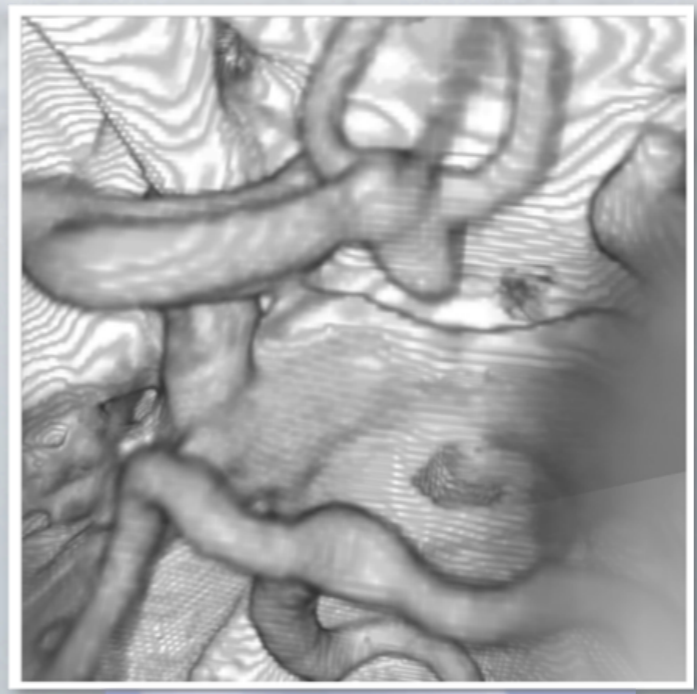
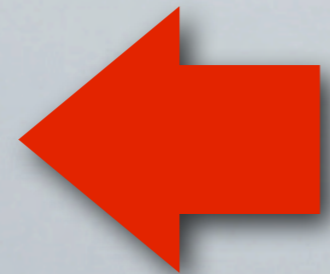
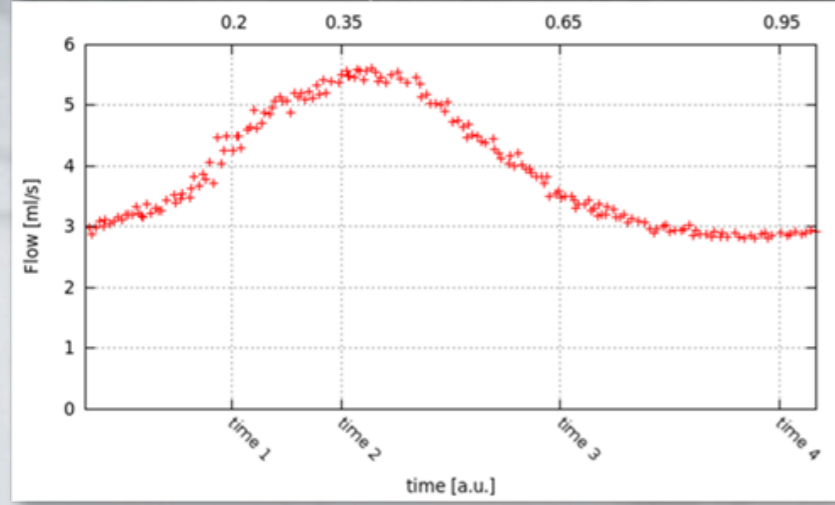
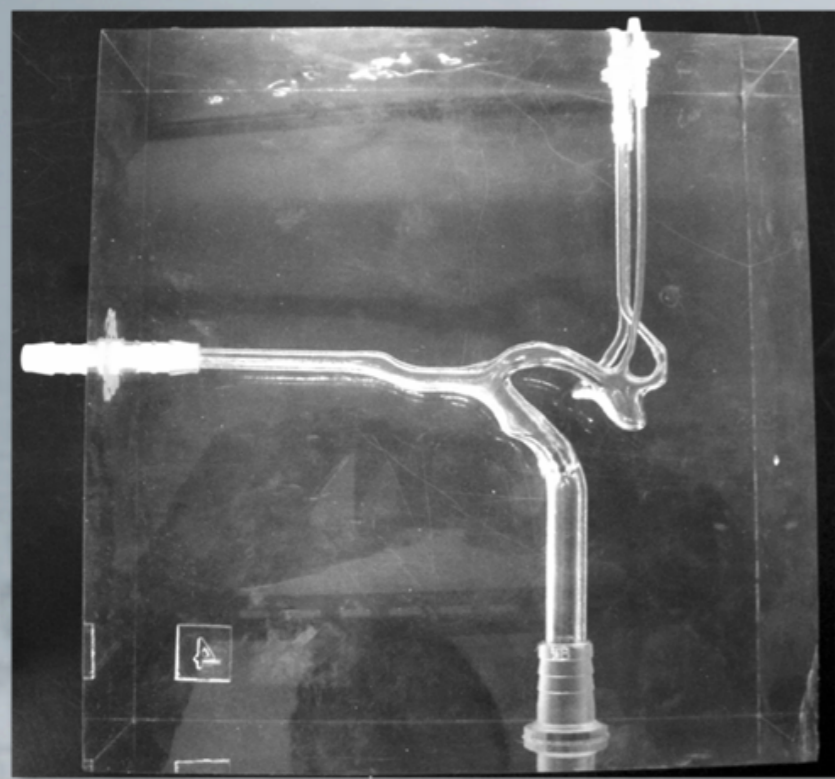
flow conditions



numerical solution



## Validation: CFD vs. PIV



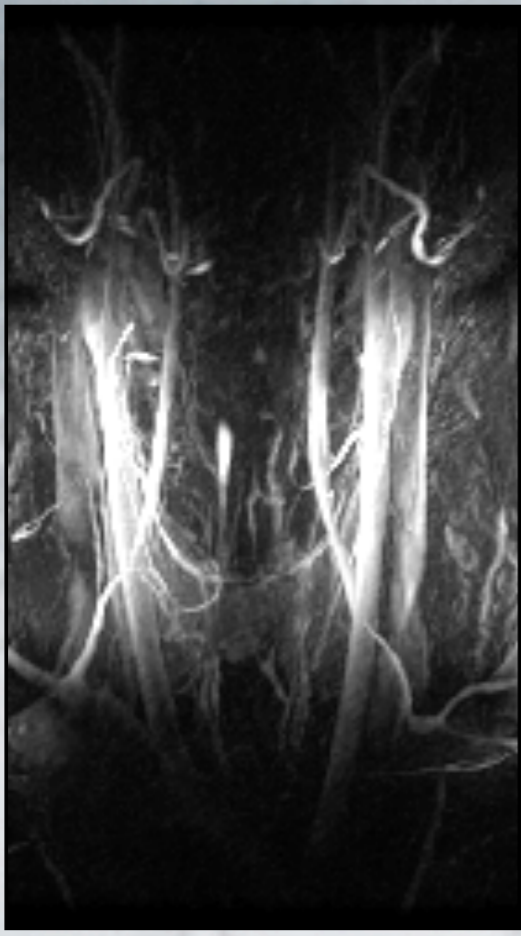
Consistent flow pattern





Validation: CFD vs. PIV

MRA

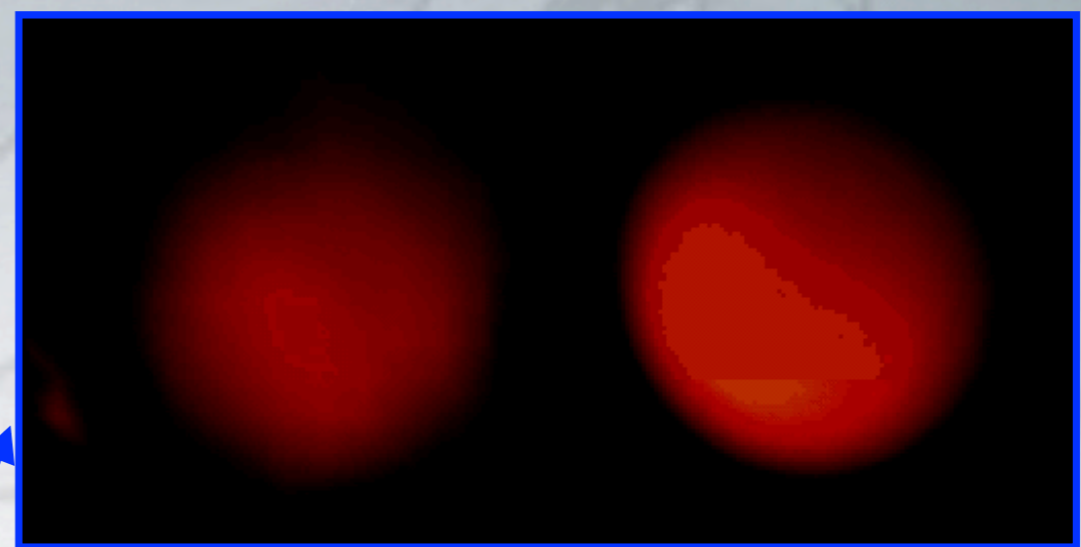
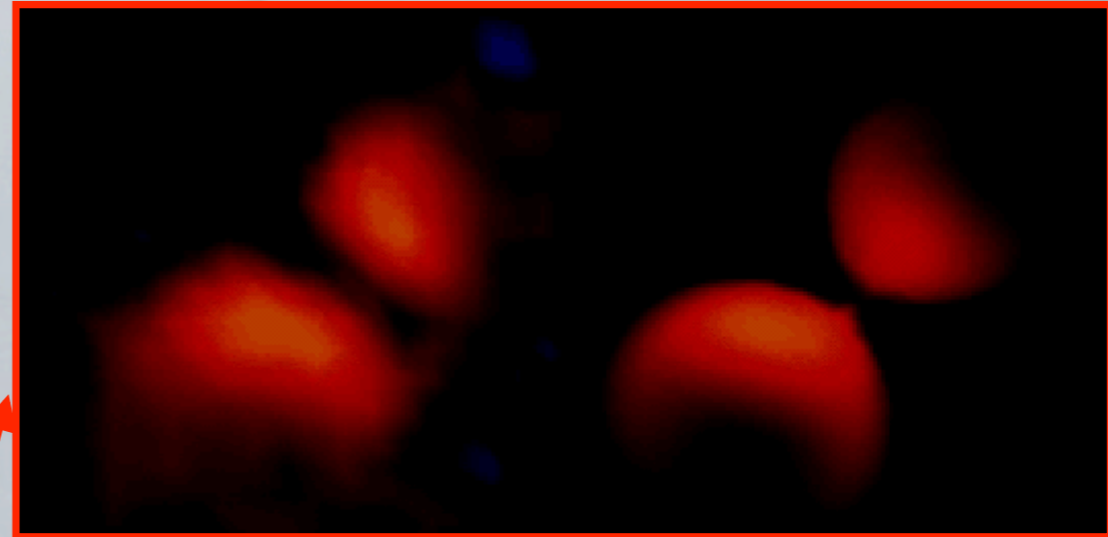


Model grid



PC-MR

CFD





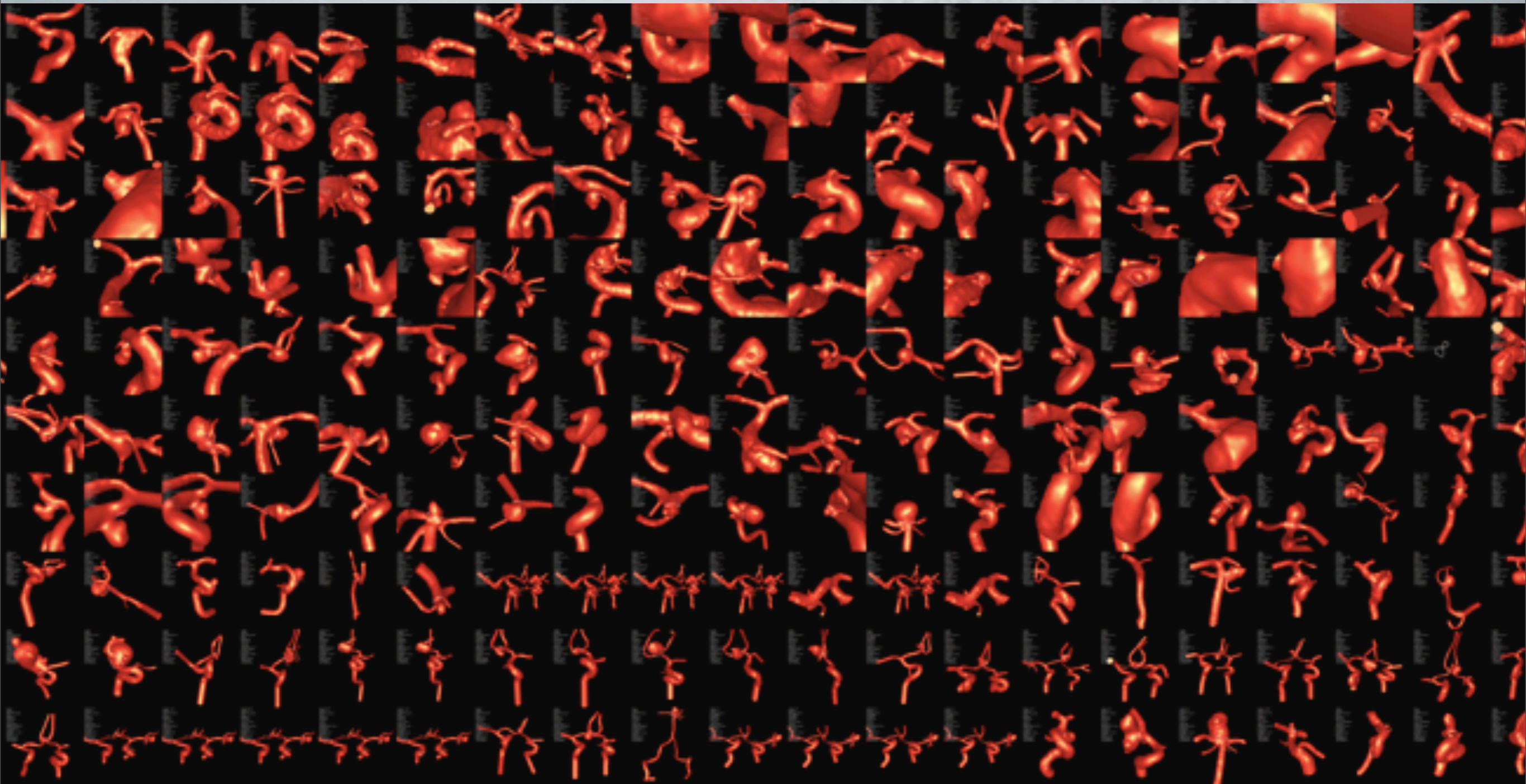
## Observations

CFD models can be made patient-specific

CFD models can provide quantitative hemodynamics information

Image-based CFD models are able to realistically represent the in vivo flow conditions

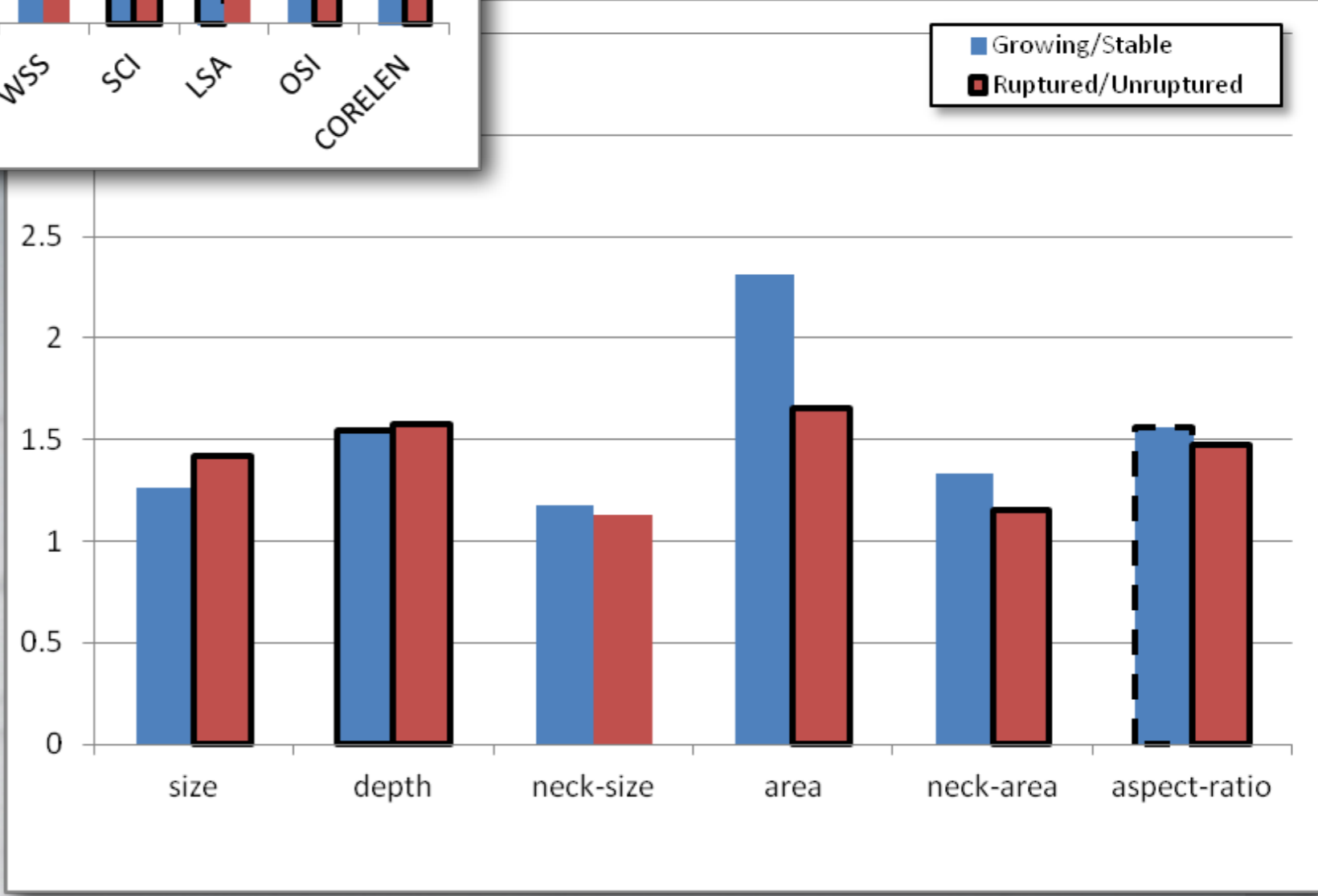
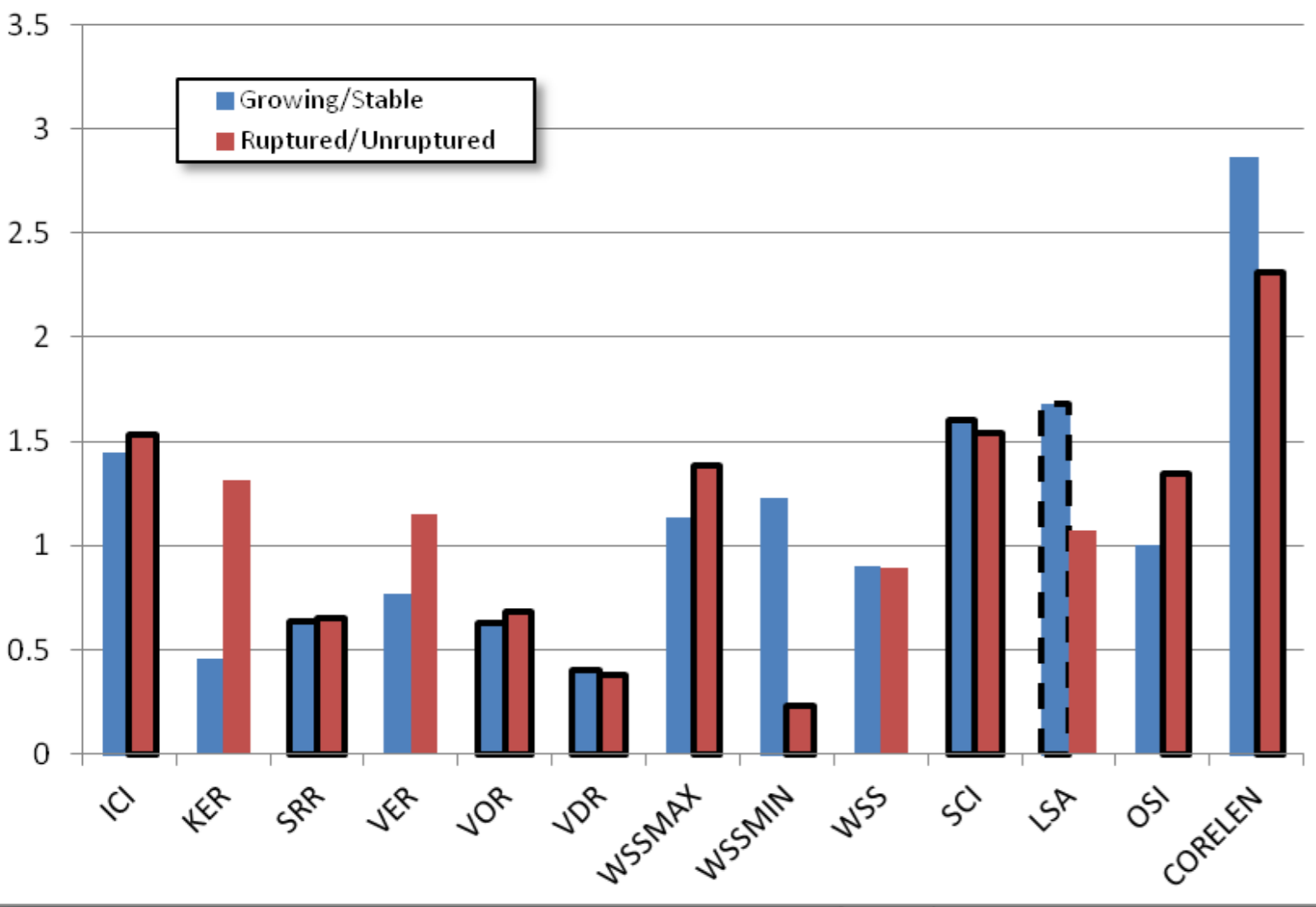




Cebral JR, Mut F, Weir J, Putman CM, "Association of hemodynamic characteristics and cerebral aneurysm rupture", AJNR, 32(2): 264-270, 2011



Global aneurysm characteristics



Longitudinal data:  
Growing vs. Stable

Cross sectional data:  
Ruptured vs. Unruptured



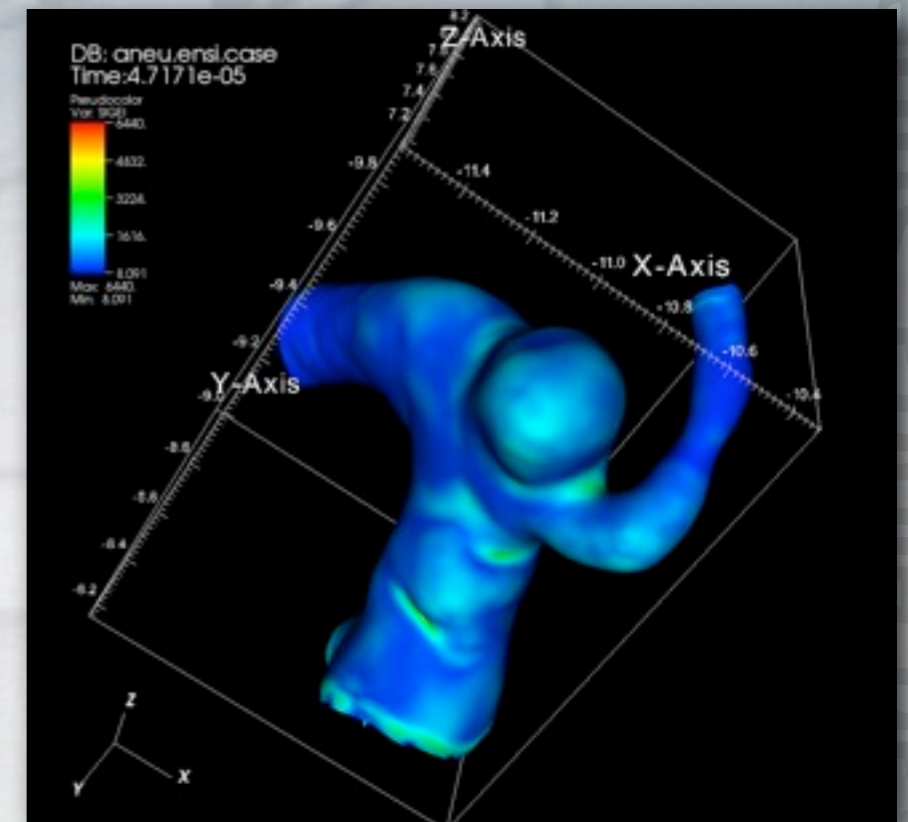
## Observations

Growing aneurysms tend to have concentrated inflows that induce complex flows and concentrated wall shear stress distributions with large areas of low WSS

Aneurysms typically grow towards the dome, but also at the body or neck

Contacts with peri-aneurysmal environment structures can affect the hemodynamics and aneurysm growth

Local conditions that cause focalized aneurysm growth still under investigation

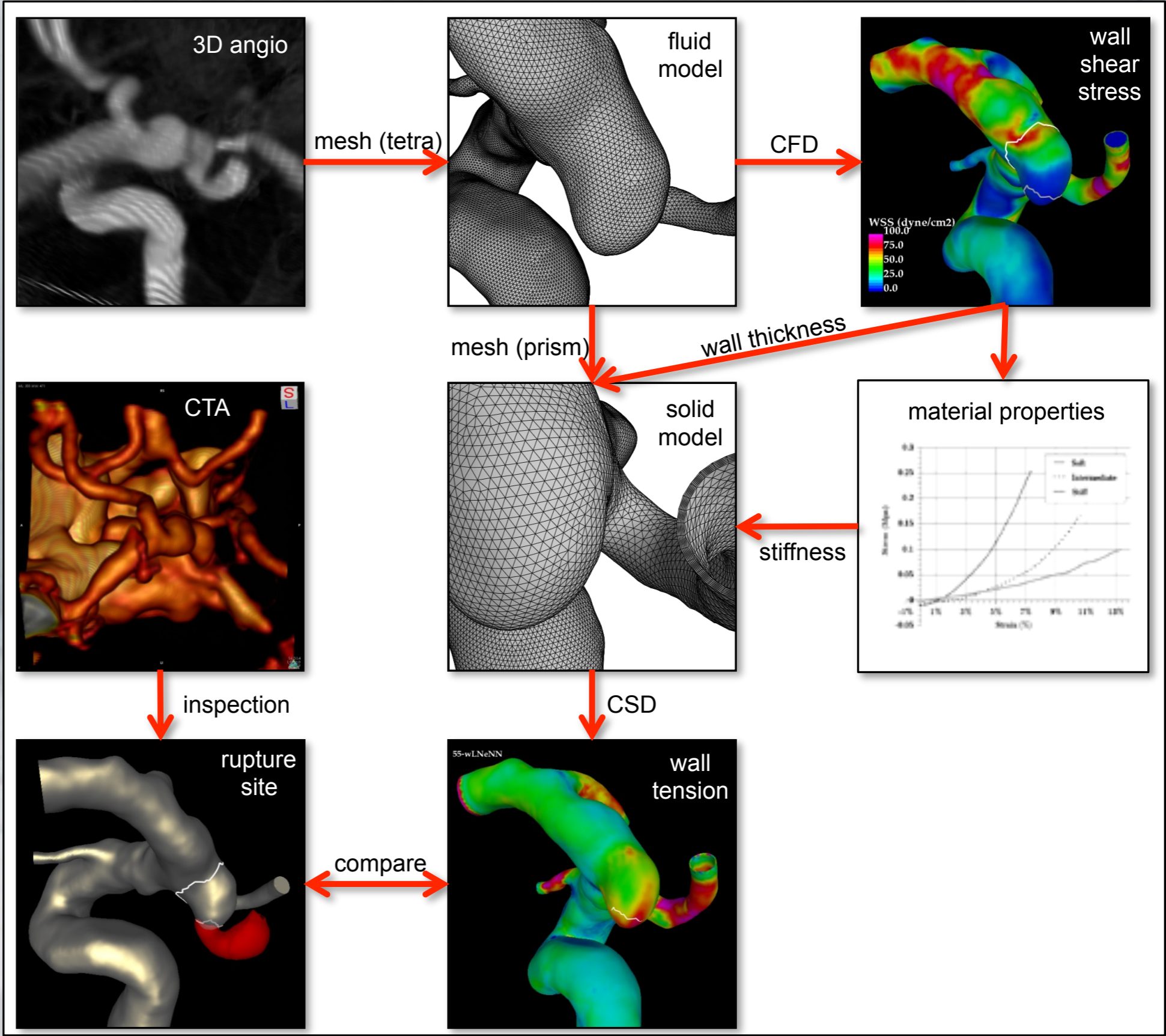




# Cerebral Aneurysms

Study design:

Compare rupture site with wall tension





## CFD + CSM

CFD provides the WSS (peak, mean, max) and the surface mesh

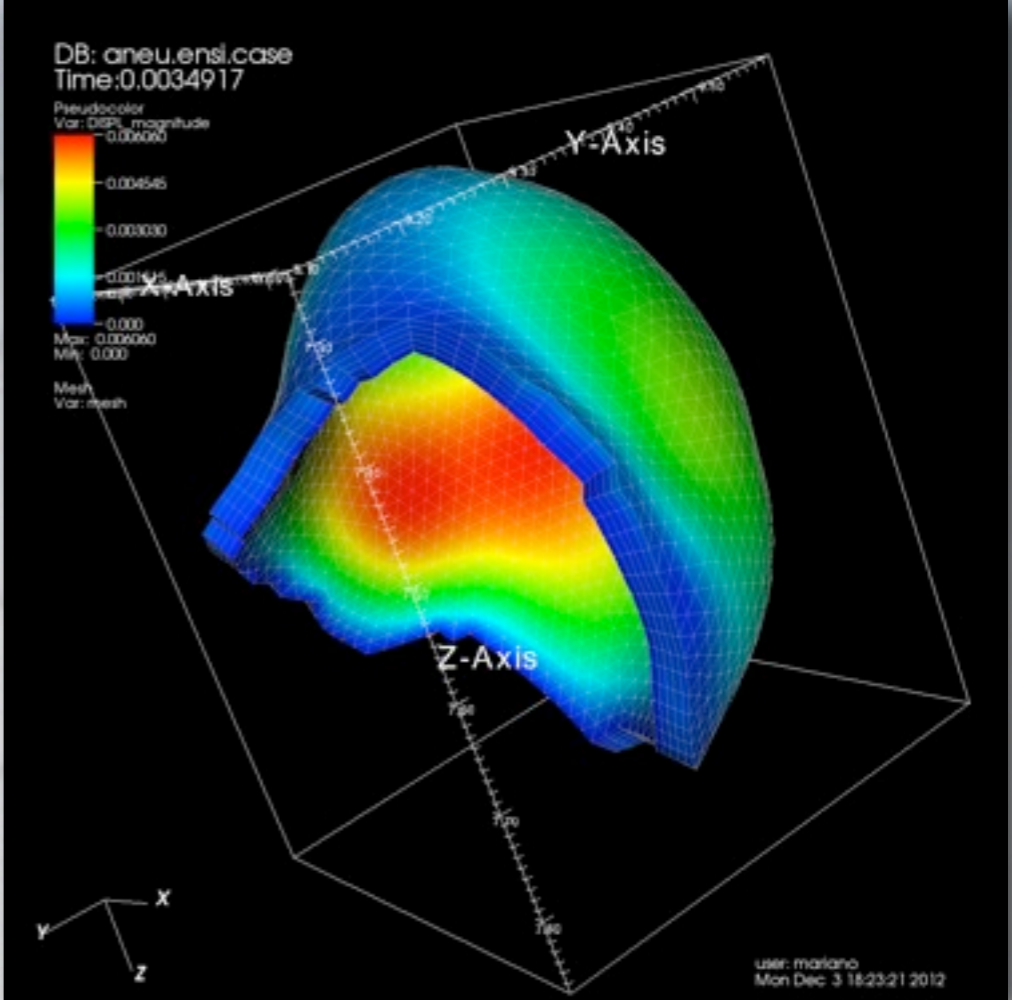
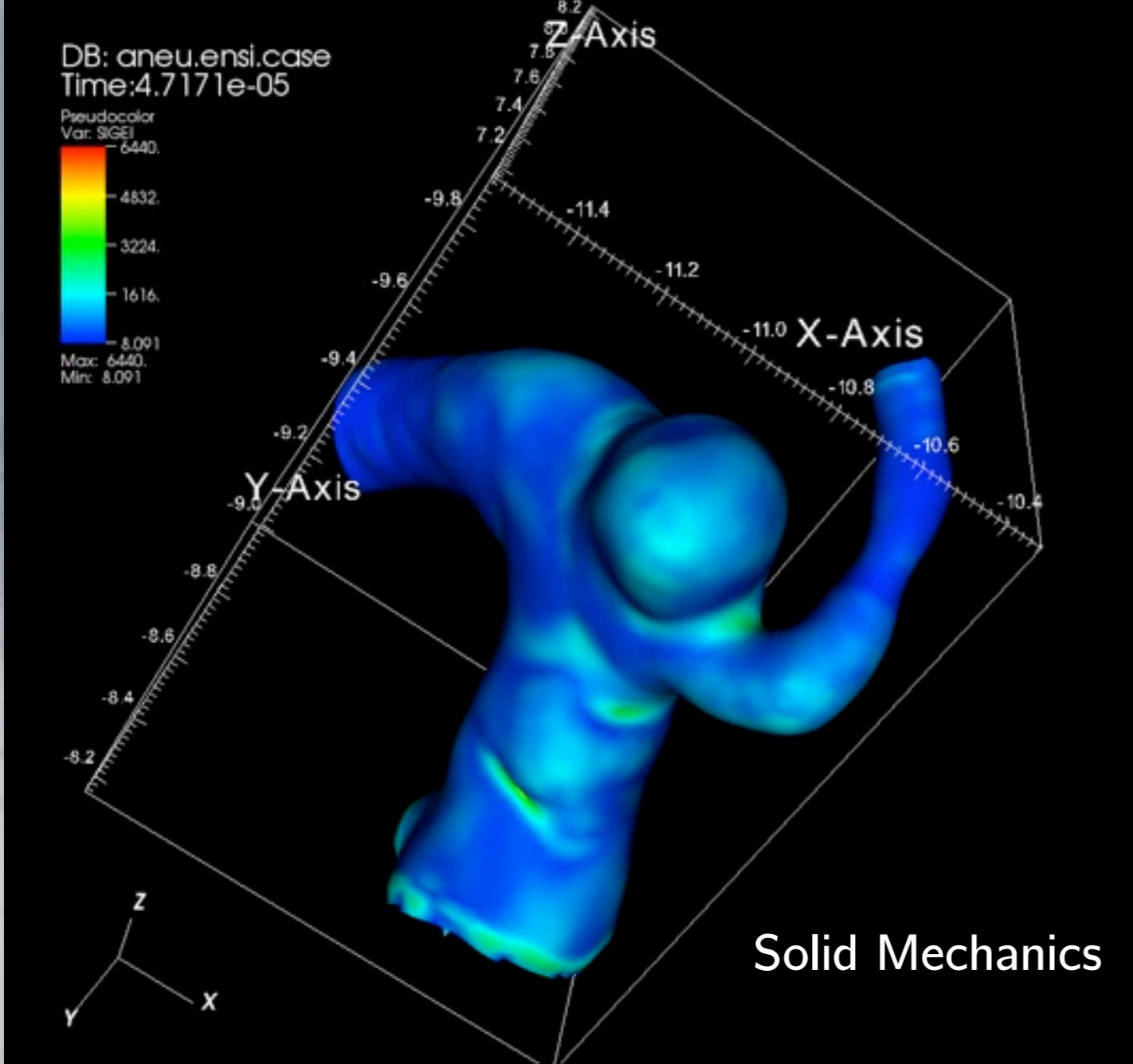
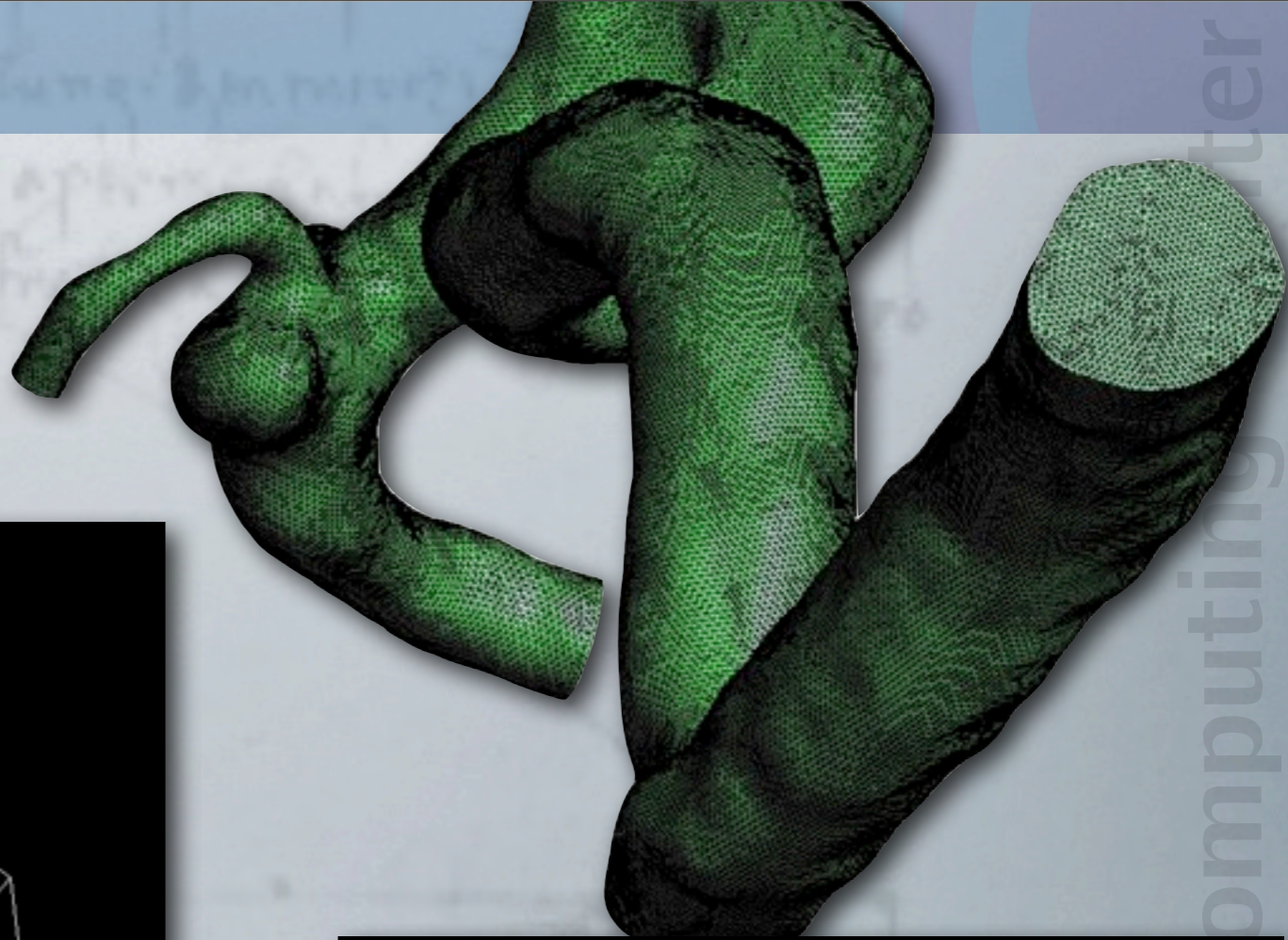
A 3D solid mesh is created by extrusion, 200 - 500 K prisms

Hyperelastic material, large deformations

Each run takes a few minutes in Marenostrium

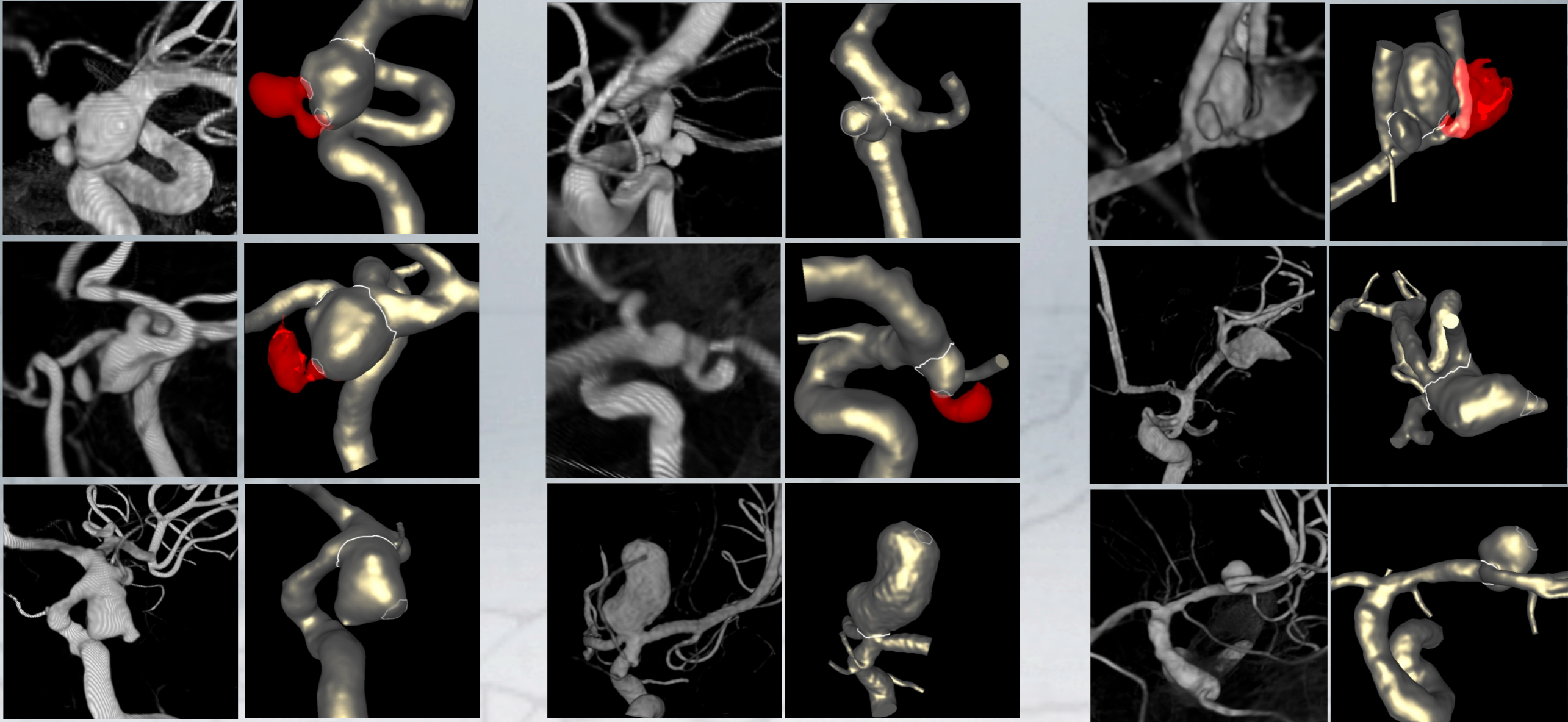


# Cerebral Aneurysms





Nine patients





## Strategy

Module material properties from Wall Shear Stress coming from CFD

Hypothesis:

High WSS weakens the wall => make it thinner

Low WSS weakens the wall => make it thinner

Analyze Rankine damage criteria

See whether its maxima coincides with the rupture sites



Show Movie



# Cerebral Aneurysms

uniform

thin => high

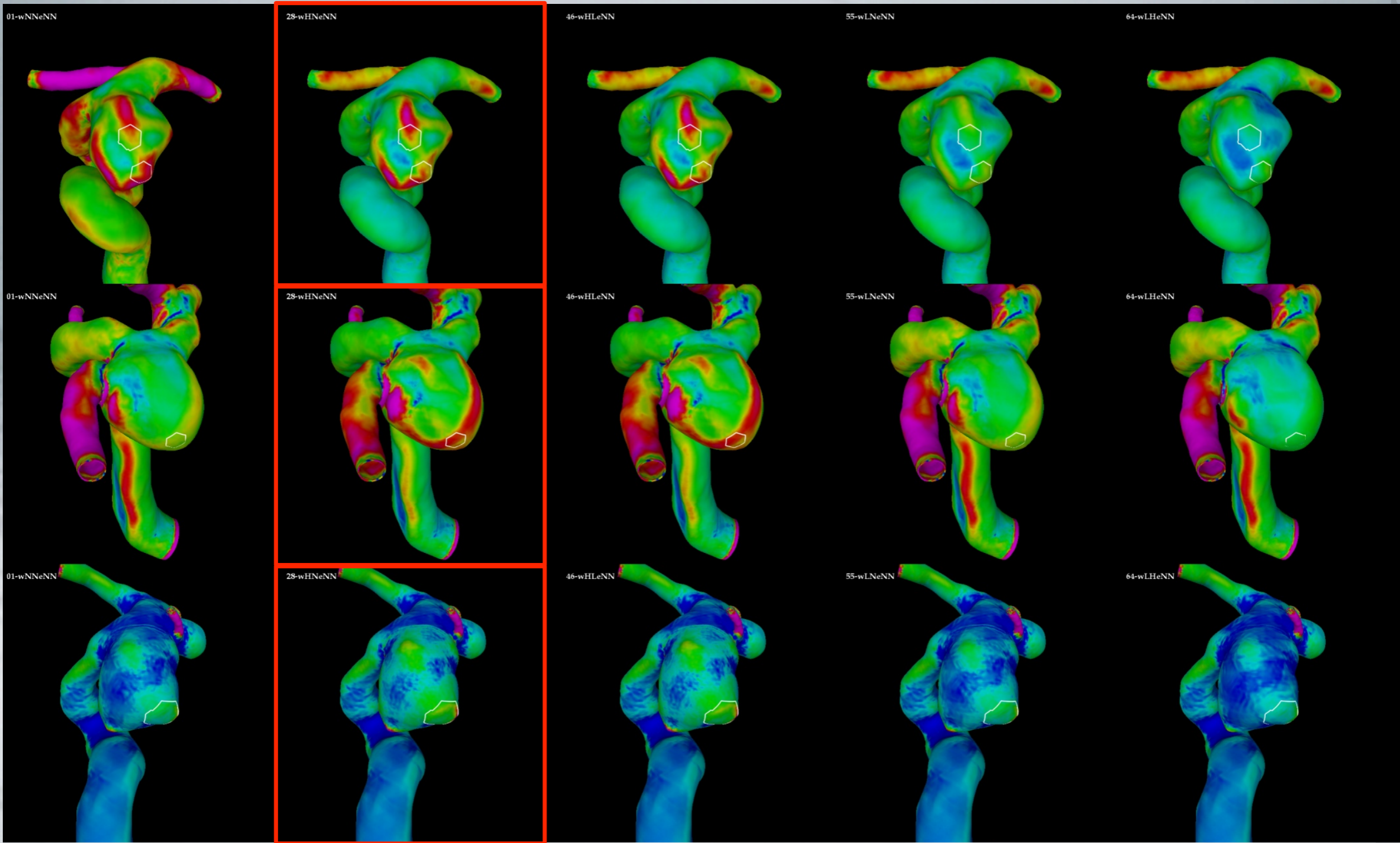
thin => high

thick => low

thin => low

thin => low

thick => high





# Cerebral Aneurysms

uniform

thin => high

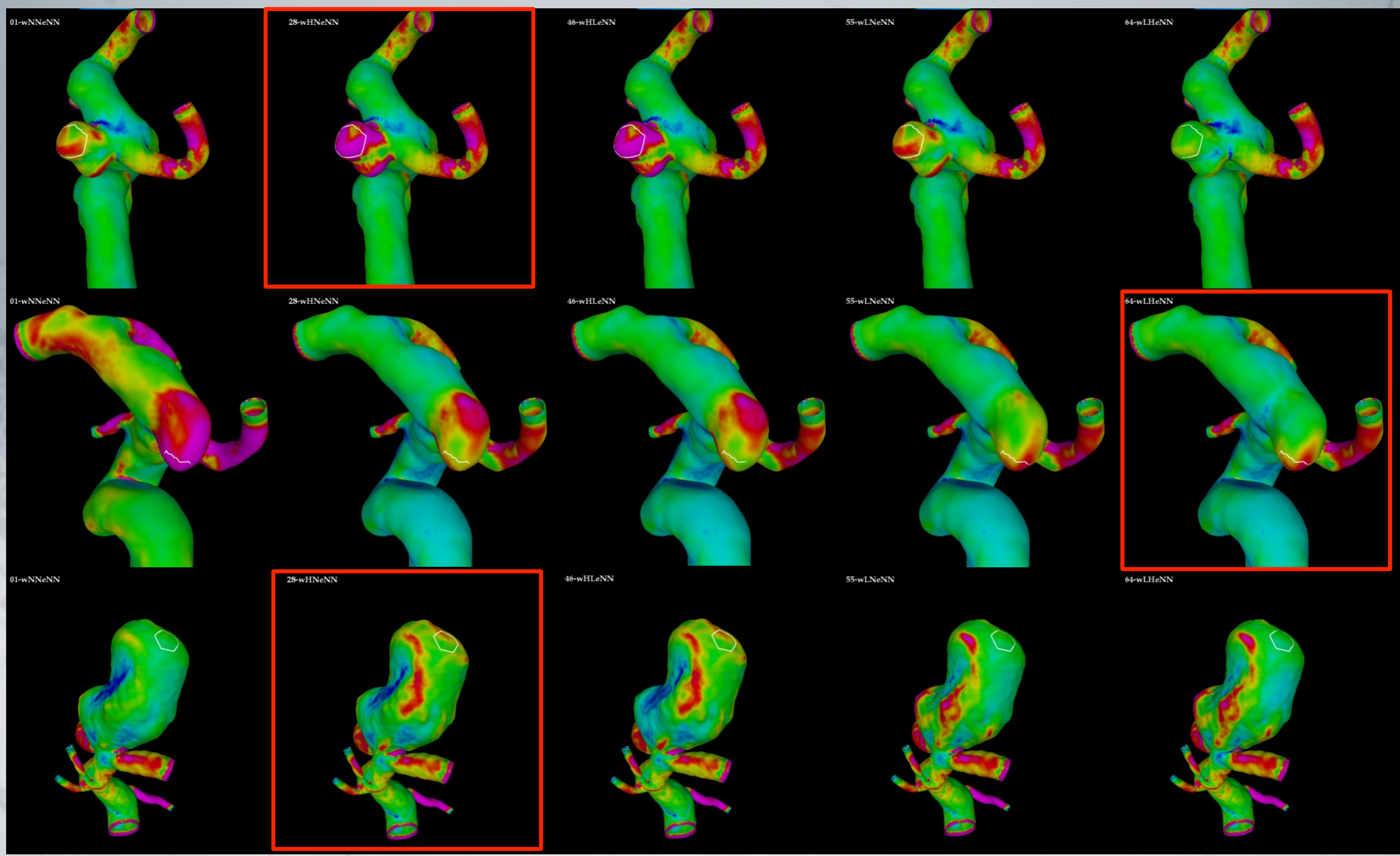
thin => high

thick => low

thin => low

thin => low

thick => high





# Cerebral Aneurysms

uniform

thin => high

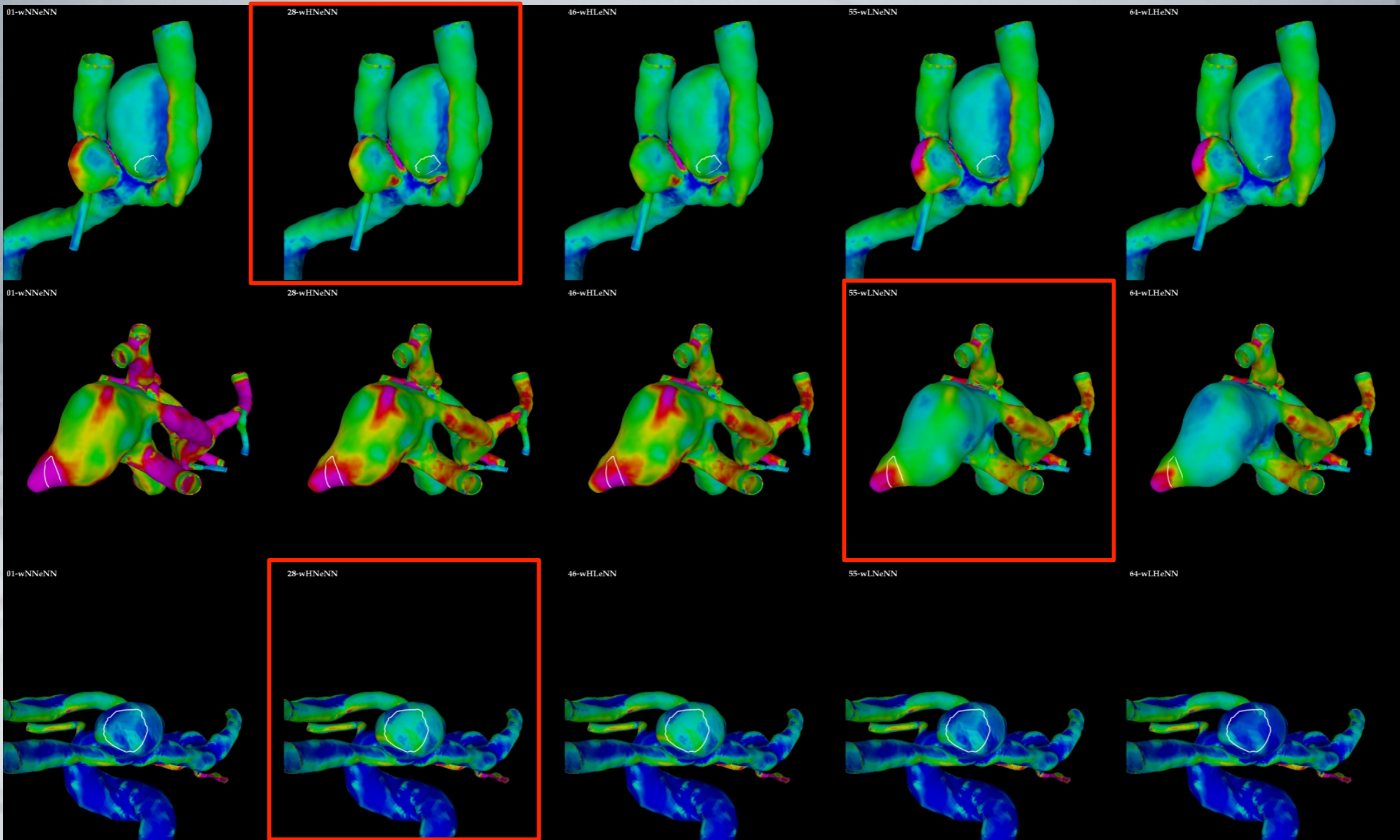
thin => high

thick => low

thin => low

thin => low

thick => high





## Observations

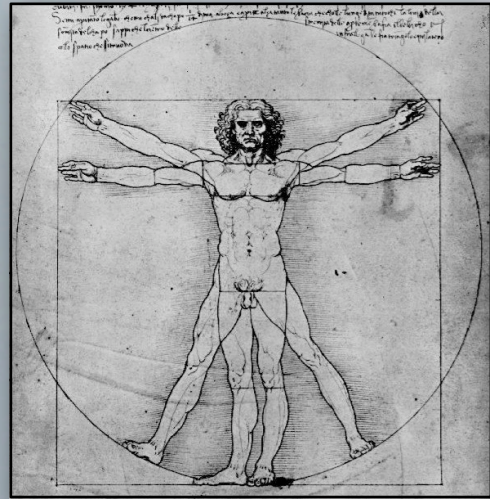
Thinner walls in regions of **high WSS** best explains  
7-8 / 9 sites of aneurysm rupture

Thinner walls in regions of **low WSS** best explains  
1-2 / 9 sites of aneurysm rupture

Two possible pathways to rupture?

Other factors?





## Conclusions





## Conclusions

Computer models are a powerful tool for:

Basic Science: propose and test hypotheses about mechanisms of aneurysm formation, growth and rupture

Risk Assessment: identify conditions that predispose aneurysms for rupture

Device Evaluation: test devices on “virtual patients”

Treatment Planning: identify conditions that promote fast and stable aneurysm occlusion after treatment

Improve material models, including material layers



**George Mason**

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Rainald Löhner, PhD

Fernando Mut, PhD

Daniel Sforza, PhD

BongJae Chung, PhD

Greg Byrne - graduated

Marcelo Raschi – graduated

**Inova Fairfax Hospital**

Christopher Putman, MD

Richard Pergolizzi, MD

**BSC - Spain**

Mariano Vazquez, PhD

Guillaume Houzeaux, PhD

**U Pittsburg**

Anne Robertson, PhD

Khaled Aziz, MD

**ENERI – Argentina**

Pedro Lylyk, MD

Esteban Scrivano, MD

Carlos Bleise, MS

**Mayo Clinic**

David Kallmes, MD

Ram Kardivel, MD

**UCLA**

Fernando Viñuela, MD

Satoshi Tateshima, MD

Aichi Chien, PhD





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**Severo Ochoa Research  
Seminar Series**



Barcelona Supercomputing Center