

# Modelling Multiscale Complex Systems: A Methodological Approach



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On behalf of the COAST consortium:

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# **COMPLEX AUTOMATA MODELLING**

Many complex systems encompass a wide range of spatial and temporal scales, and are difficult to describe using a homogeneous model.

A Complex Automaton (CxA) for a multiscale problem is defined by

a collection of single scale models based on Cellular Automata, lattice Boltzmann models, Agent Based models,

• a Scale Separation Map (SSM), where the subprocesses occupy well-defined regions in the plan of temporal-spatial scales (fig.1)

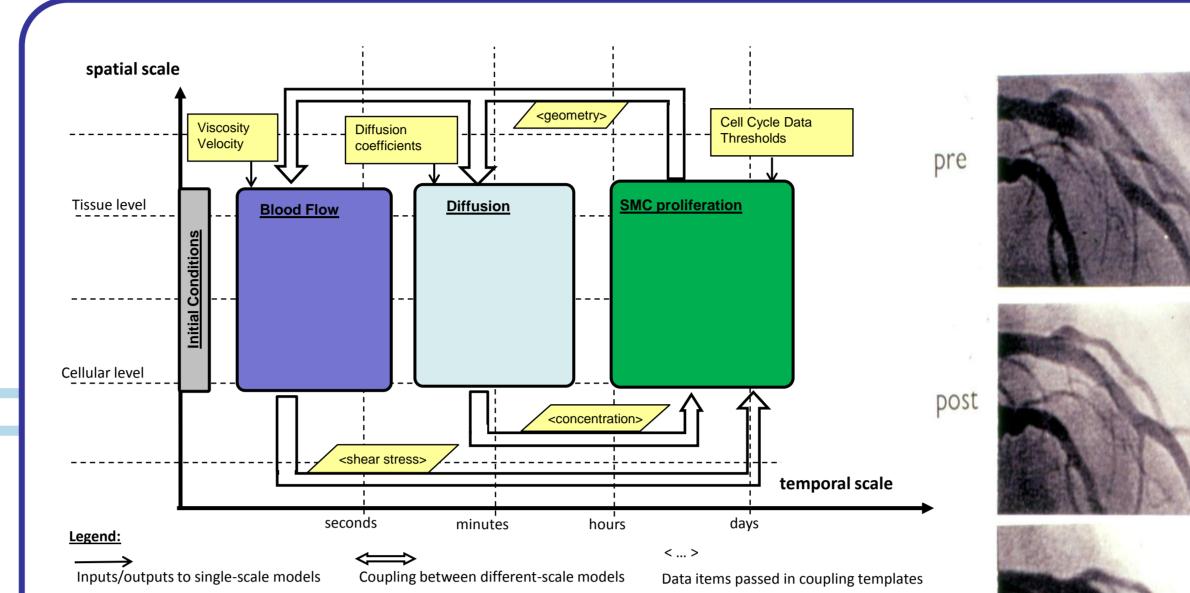
• coupling templates: the way the

## **In-stent Restenosis**

A stenosis is a narrowing in a blood vessel. A possible treatment consists of deploying a metal mesh (*stent*) against the wall of the artery. A maladaptive response of the artery to the injury can trigger an abnormal tissue growth, causing eventually a restenosis (figure 2).

It is a multi-scale multi-science system, covering a range of phenomena from *biology*, physics, chemistry and medicine, and crossing many orders of magnitude in temporal and spatial scales.

The in-stent restenosis will be the primary demonstrator application of the complex automata modelling.



A simplified description of the system in terms of relevant scales is drawn in fig. 1.

#### subprocesses interact.

The **COAST** project (Complex Automata Simulation Technique) aims at developing a general formalism for the CxA approach and a simulation framework for multiscale modelling.

### **SMOOTH MUSCLE CELLS HYPERPLASIA**

SMCs are simulated via an Agent Based Model, where each agent represents a cell, reacting to mechanical and biological inputs

### **Migration: mechanical interactions**

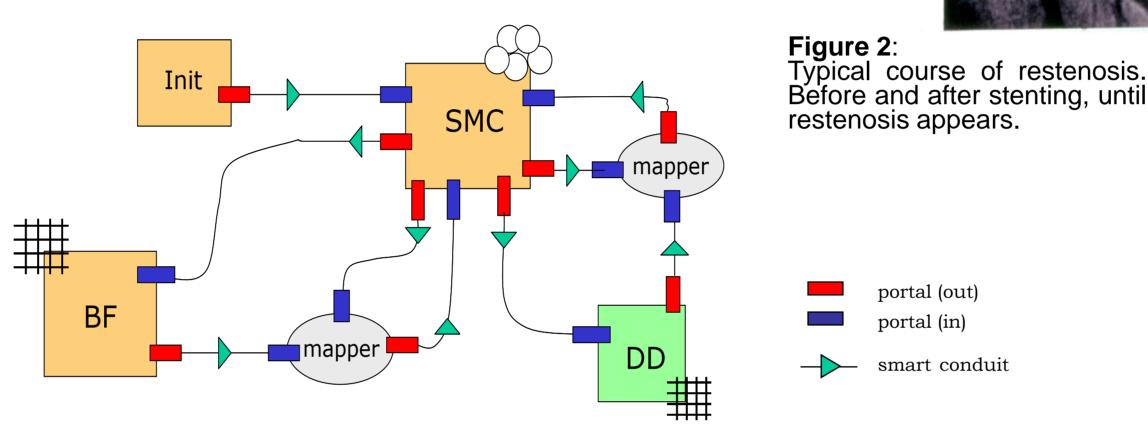
- attractive force depending on adhesion
- repulsive force depending on overlap
- friction force with the surrounding tissue

#### **Proliferation: Cell Cycle**

Cell life is modelled by a three-stages cycle:

- **GO**: quiescent state
- **G1**: first growth stage
- **G2**: final stage leading eventually to

**Figure 1**: Simplified Scale Separation Map for in-stent restenosis, presenting the relevant subprocesses, their ranges of spatial and temporal scales, and the mutual coupling. 6/12



**Figure 3**: Connection Scheme for the CxA model of ISR, including Bulk Flow (**BF**), **SMC**, Drug Diffusion (**DD**), initial condition generation (**Init**), and two mappers, dealing with coordinates conversion (lattice to cells). Single scale models are connected to framework with portals, and communicate via smart conduits.

	Constrained Constrained States

A model for Smooth Muscle Cells tissue growth (slowest time scale) is coupled to a fast blood flow. A diffusion model on an intermediate time scale can be used to take into account drug eluting stents.

## MUSCLE: A COMPLEX **AUTOMATA FRAMEWORK**

Within COAST, we develop a software environment where CxA can be naturally implemented.

#### The MUltiScale Coupling Library and Environment (MUSCLE)

based on JADE: Java platform for multi agent based simulation (MABS)

CA-like single scale models are wrapped into agent

agents communicate via smart conduits, a kind of "pipes" where data can be modified to match a specific output format

conduits with filter mechanisms, allowing configuration of common conduit

### proliferation (*mitosis*)

Checkpoints are introduced through the cycle, regulated by a set of biological rules, depending on neighbouring cells, wall shear stresses, drug fluid concentration.

### **Coupling templates:** Bulk flow to SMC

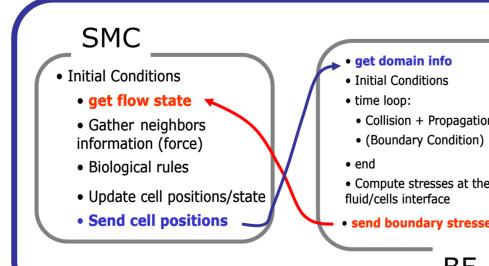
Averaged fluid wall stresses are integrated along the tissue boundary. Taking the grid points in the fluid domain close to each cell Agent, we compute

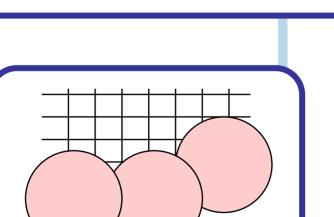
- Oscillatory Stress Index (OSI),
- Maximum Wall Shear Stress.

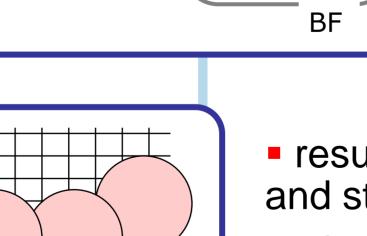
### Drug Diffusion to SMC

At the steady state, drug concentrations for each SMC agent are computed, integrating the concentration field over the area of each cell.

#### SMC to Bulk Flow, **SMC to Drug Diffusion**







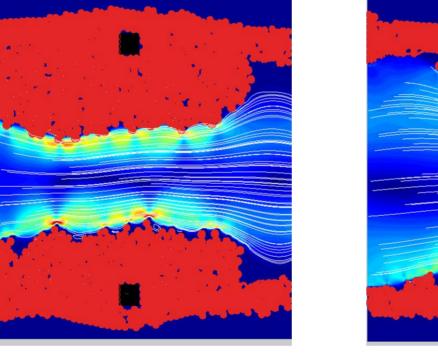


Figure 4: Results of ISR simulations: struts (black), SMC (red), blood flow (streamlines and color coding according to shear stress (red high, blue low)).

Left: Equilibrated initial condition after stent deployment; Middle: Simulated ISR with bare metal stent after 400 time steps (~ 18 days); Right: with a drug eluting stent after 400 time steps.

#### functionality (interpolation, scaling, etc.) compatible with different software, programming languages and hardware distributed communication open source

With MUSCLE, a CxA-simulation is driven by a **Connection Scheme** graph (fig.5) whose vertices are the *kernels* (single scale codes Java portals connecting it to the + framework) and smart conduits defining the edges.

### **BLOOD FLOW (BF)**

Haemodynamics is governed by incompressible Navier-Stokes equations, and simulated numerically using a **lattice Boltzmann method** 

flow simulation is run until a stationary (periodic) state (fig. 1)

- results for averaged wall stresses (pressure) and stress) are passed to the SMC model.
- when tissue growth modifies the vessel geometry, a new flow simulation is carried out.

### **DRUG DIFFUSION (DD)**

Drug eluting stents represent an effective way of inhibiting neointima formation after stent deployment. We model this process with a generic anisotropic diffusion equation, solved numerically by a Cellular Automata – Finite Difference method.

The computational domain is decomposed in *tissue* (portion of space occupied by SMC), source (the stent strut) and *sink* (the lumen).

We assume that DD has a time scale smaller than SMC. After each SMC iteration a new steady state

After cell migration and proliferation, new cell positions and radii are sent to the coupling framework and transformed into a new voxelized geometry, depending on the space discretization of BF and DD.



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#### concentration field is computed as input to the SMC model.

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