



# Mathematical Modelling and Simulation of Atherosclerosis Formation and Progress: A Review

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(Received 14 December 2018; accepted 10 April 2019; published online 24 April 2019)

Associate Editor Dan Elson oversaw the review of this article.

**Abstract**—Cardiovascular disease (CVD) is a major threat to human health since it is the leading cause of death in western countries. Atherosclerosis is a type of CVD related to hypertension, diabetes, high levels of cholesterol, smoking, oxidative stress, and age. Atherosclerosis primarily occurs in medium and large arteries, such as coronary and the carotid artery and, in particular, at bifurcations and curvatures. Atherosclerosis is compared to an inflammatory disease where a thick, porous material comprising cholesterol fat, saturated sterols, proteins, fatty acids, calcium etc., is covered by an endothelial membrane and a fragile fibrous tissue which makes atheromatic plaque prone to rupture that could lead to the blockage of the artery due to the released plaque material. Despite the great progress achieved, the nature of the disease is not fully understood. This paper reviews the current state of modelling of all levels of atherosclerosis formation and progress and discusses further challenges in atherosclerosis modelling. The objective is to pave a way towards more precise computational tools to predict and eventually reengineer the fate of atherosclerosis.

**Keywords**—Atherosclerosis, Biochemical, CFD, Haemodynamics, Multiscale multiphysics modelling, LDL mass transport.

## THE PATHOPHYSIOLOGY OF ATHEROSCLEROSIS

Atherogenesis is an inflammation-related procedure associated with high concentration of low-density lipoprotein (LDL) in the blood and is affected by systemic risk factors such as hypertension, smoking, hyperlipidemia, hyperhomocysteinemia, and diabetes mellitus.<sup>23</sup> It usually occurs in regions near bifurcations, curves and artery branches where disturbed flow

patterns take place and subsequently low values of endothelial shear stress (ESS) are expected.<sup>14</sup> Endothelial cells (ECs) tend to change their morphology when subjected to wall shear stress, i.e. their shape is either elongated under high wall shear stress or rounded/polygonal with no particular alignment pattern under low or oscillating wall shear stress.<sup>85</sup> These conformational changes of ECs associated with low ESS might be responsible for the widening of the junctions between ECs, therefore these small “gaps” between ECs, in combination with flow stagnation and the subsequent prolongation of the residence time of circulating LDL, facilitate the infiltration of LDL underneath the endothelium.<sup>14</sup> The LDL in the artery wall is modified by oxygen radicals to oxidized LDL (oxLDL) causing oxidative stress which in turn induces endothelial cells to express adhesion molecules serving as ligands of leukocyte receptors, such as vascular cell-adhesion molecule-1 (VCAM-1), intercellular adhesion molecule-1 (ICAM-1), and P-selectins<sup>27</sup> subsequently causing the adhesion of blood-borne leukocytes (mainly monocytes and T cells). In addition, oxLDL particles stimulate ECs and smooth muscle cells (SMCs) to secrete monocyte chemoattractant protein-1 (MCP-1) and monocyte colony stimulating factor (M-CSF).<sup>103</sup> Once adherent, the leukocyte infiltrates between intact endothelial cells to penetrate into tunica intima. This directed migration requires a chemoattractant gradient: (i) for monocytes it is the particular interaction of MCP-1 that binds to its receptor CCR2 expressed by the monocyte; (ii) for T-cells known chemoattractants include a trio of interferon- $\gamma$  (IFN- $\gamma$ )-inducible chemokines of the CXC family that bind to chemokine receptor CXCR3 expressed by T cells.<sup>60</sup>

M-CSF induces entering monocytes to differentiate into macrophages<sup>41</sup> that bind with oxLDL either *via* scavenger receptors (SR) or toll-like receptors (TLR)

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expressed on their surface. Binding with SRs internalizes oxLDL and leads progressively to the formation of a foam cell, so named because of the foamy appearance under the microscope, which is the result of the accumulation of lipid droplets within the cytoplasm.<sup>60</sup> During this procedure, internalization and processing of oxLDL induce the presentation of its fragments as antigens on the cell surface and this property of macrophages deems them as antigen-presenting cells (APC). On the other hand binding with TLR can initiate a signal cascade that leads to cell activation by which the activated macrophage produces inflammatory cytokines such as tumour-necrosis factor (TNF), proteases such as matrix metalloproteinases (MMP), and oxygen and nitrogen radical molecules.<sup>40,103</sup> HDL-associated Paraoxonase 1 (PON1) inhibits the influx of cholesterol by oxLDL into macrophages by reducing oxLDL levels, reducing oxLDL uptake *via* the macrophage scavenger receptor and also enhances HDL-mediated cholesterol efflux from the arterial wall into plasma and then to the liver.<sup>27</sup>

T cells in the tunica intima are in search for antigens and undergo activation after interacting with APCs, such as macrophages.<sup>41</sup> The outcome is their differentiation predominantly into T helper 1 (TH1) cells that produce inflammatory cytokines including interferon- $\gamma$  (IFN- $\gamma$ ) and TNF. These cytokines and others prompt macrophage activation, production of other pro-inflammatory mediators, activate endothelial cells and increase adhesion-molecule expression.<sup>27</sup> In addition, inflammatory cells residing in the plaque, including macrophages, produce angiogenic mediators such as vascular endothelial growth factor (VEGF) promoting neovascularization (Fig. 1).<sup>60</sup>

Thereby the inflammation cycle is maintained, and the atherosclerotic plaque progressively develops. This is formed as (i) the core filled with lipids, including cholesterol crystals, living and apoptotic foam cells and (ii) the fibrous cap consisted of mainly smooth muscle cells and collagen. The mechanism of the formation of the fibrous cap starts with the activation of endothelial cells by oxidative stress and subsequent secretion of platelet-derived growth factor (PDGF) that promotes medial and pre-existing SMCs to migrate near the endothelium. Furthermore, lipid-laden macrophages also secrete PDGF inducing SMC migration through and around them<sup>69</sup> and also basic fibroblast growth factor (FGF) that induces SMC proliferation.<sup>63</sup> In addition, within the developing plaque, the newly developed microvascular vessels may be particularly prone to micro-haemorrhage which leads to thrombin generation triggering platelet release of PDGF, further stimulating SMC migration.<sup>60</sup> Collagen production from SMCs is upregulated by transforming growth factor—beta (TGF- $\beta$ ) which is a pluripotent cytokine secreted by a number of cells,

including macrophages, platelets, endothelial cells and SMCs.<sup>41</sup> Interstitial collagen molecules confer most of the tensile strength on the fibrous cap.<sup>60</sup> This continuous process produces a distinct fibrous cap that maintains plaque integrity and avoids contact of the thrombogenic necrotic core with flowing blood.<sup>84</sup> As the plaque becomes more bulky it may protrude into the lumen hampering thereby blood flow consequently leading to ischemia and subsequent clinical manifestations such as angina (Fig. 2).<sup>60</sup>

Plaque vulnerability is promoted by the presence of (i) IFN- $\gamma$ , which counteracts fibrous cap formation by enhancing collagen degradation and inhibiting smooth muscle cell proliferation and (ii) MMPs that degrade collagen fibers<sup>37</sup> and are, however, counteracted by tissue inhibitors of metalloproteinase (TIMPs) synthesized by ECs, SMCs and macrophages.<sup>88</sup> Therefore, the weakened cap, which cannot withstand the hemodynamic forces may rupture and consequently, expose thrombogenic plaque material (tissue factor) to the blood stream.<sup>41</sup> The subsequent precipitation of platelets and coagulation factors forms a thrombus which if occludes the vessel persistently can lead to an acute myocardial infarction.<sup>60</sup> If the thrombus detaches it may lead to occlusion of important vessels in the circulatory system including cerebral vessels thus leading to a stroke.

## MATHEMATICAL MODELLING OF ATHEROSCLEROSIS FORMATION

### *LDL Mass Transport*

#### *Haemodynamics*

Blood flow can be either described by the Navier–Stokes (N-S) equation or the modified N-S incorporating Womersley parameter. In the first case Navier–Stokes and the continuity equations of incompressible fluid are:

$$\rho \left( \frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} \right) = -\nabla p + \mu \nabla^2 \mathbf{u} \quad (1)$$

$$\nabla \cdot \mathbf{u} = 0 \quad (2)$$

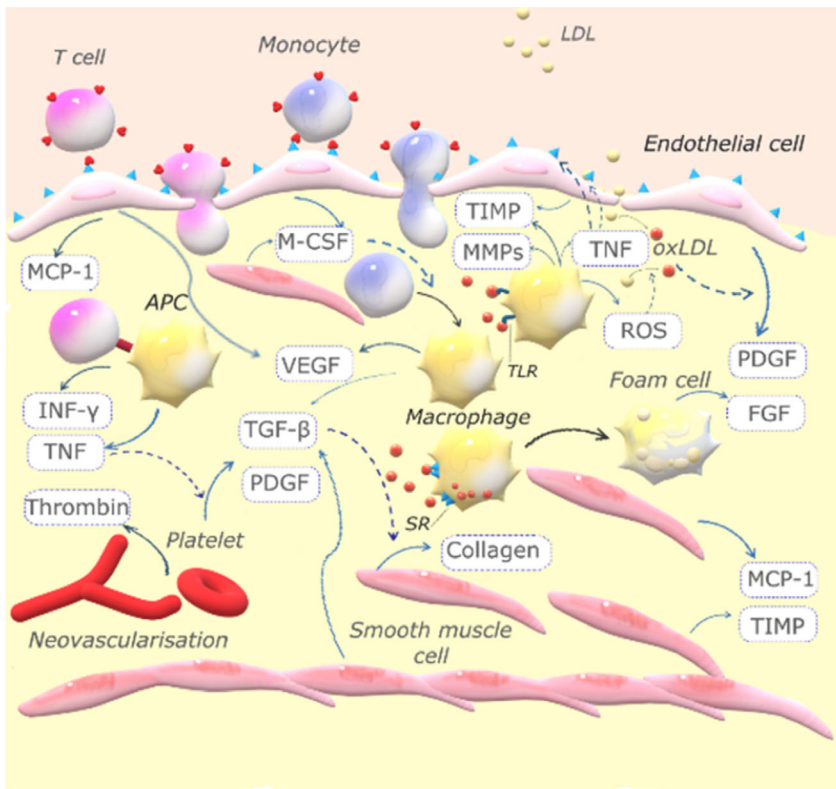
where  $\mu$  is the dynamic viscosity of blood,  $\mathbf{u}$  is the blood velocity vector in the vessel,  $\rho$  is the blood density, and  $p$  is the pressure.

In the second case, the general form of the non-dimensional N-S with Womersley parameter is given as<sup>94</sup>:

$$\alpha^2 \frac{\partial \mathbf{u}}{\partial t} + \text{Re} \mathbf{u} \cdot \nabla \mathbf{u} + \text{Re}_1 \nabla p - \nabla^2 \mathbf{u} + \frac{R^2}{K} \mathbf{u} = 0 \quad (3)$$

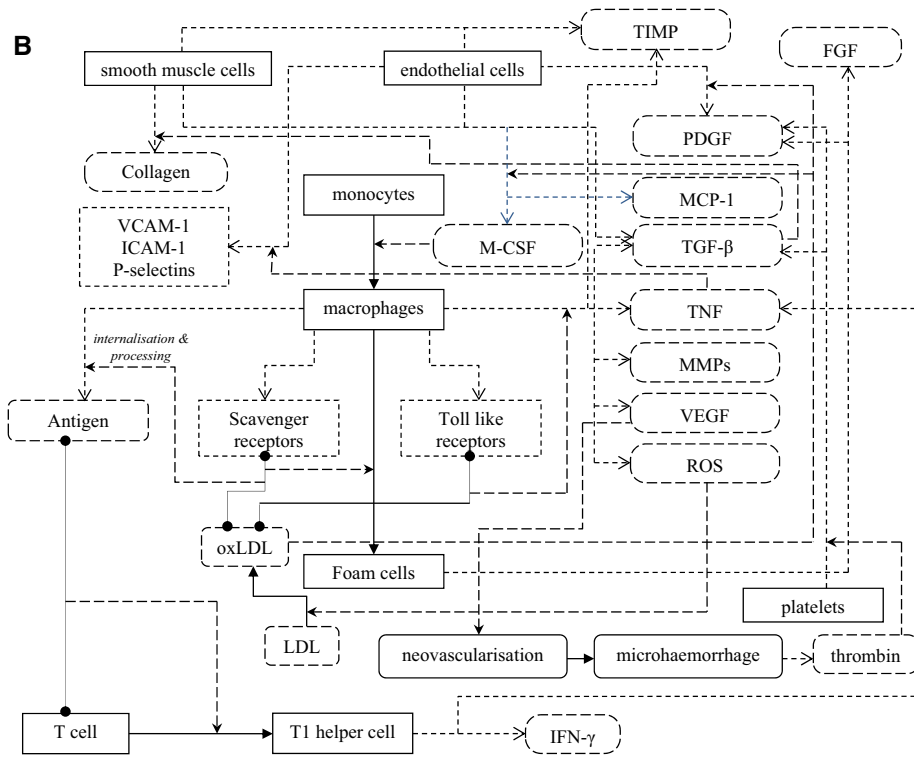
where the square root of the oscillatory Reynolds number  $a = R(\omega/\nu)^{1/2}$  is known as Womersley parameter,  $\omega$  is the circular frequency,  $R$  is the inlet radius,  $\text{Re}_1 = \max$

**A**



—————> differentiate/become/lead to  
 - - - - -> induce  
 ————> secrete/express/expose

**B**

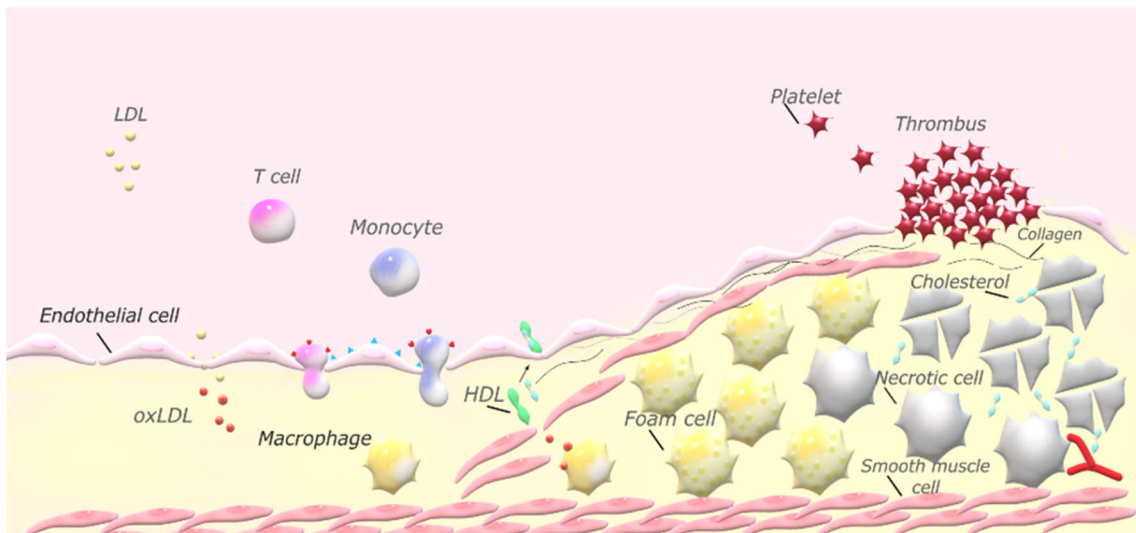


**Legends**

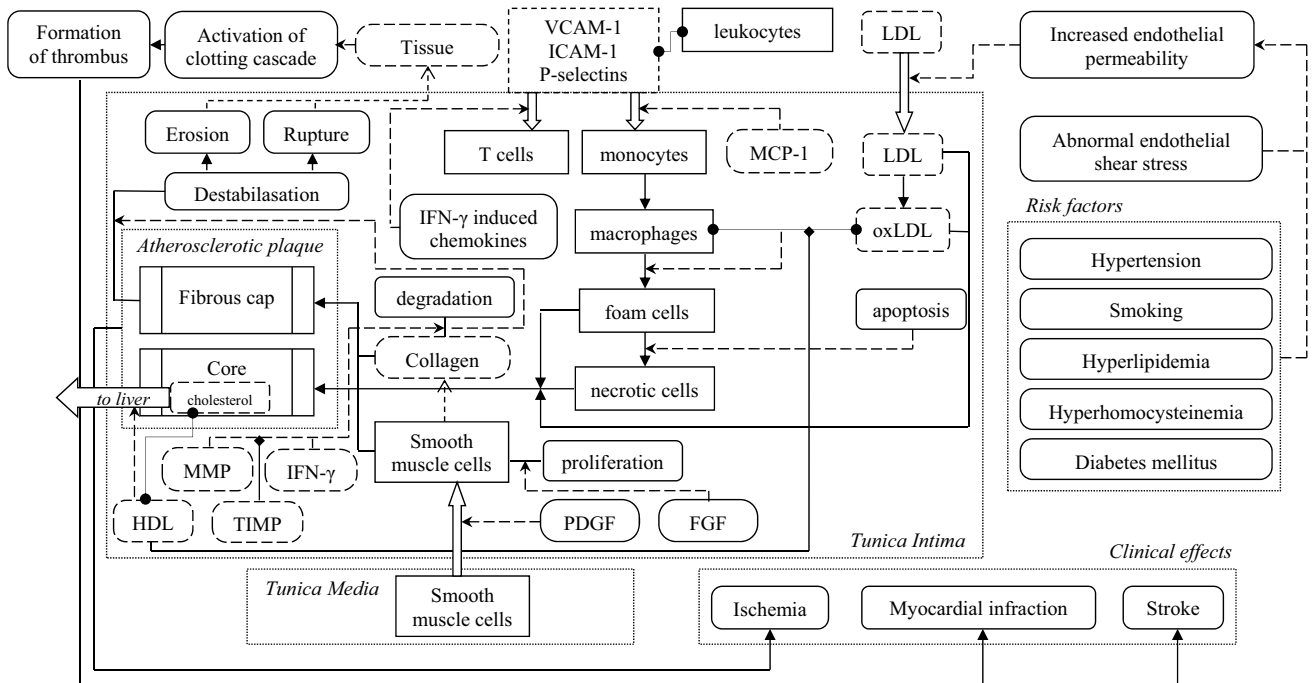
—————> inhibit  
 —————> differentiate/become/lead to  
 - - - - -> secrete/express/expose  
 - - - - -> induce  
 ————> migrate/infiltrate/transport  
 ● — ● interact/bind  
 — relate  
 (dashed box) molecule  
 (solid box) cell  
 (double box) tissue  
 (dashed box) receptor/adhesion molecule  
 (solid box) event

**FIGURE 1. (a) Main biochemical interactions of the atherogenesis mechanism. (b) Diagrammatic representation of the main biochemical interactions of the atherogenesis mechanism.**

A



B



**FIGURE 2. (a) Main processes of the atherosclerotic plaque progression and rupture: Entering of Leukocytes into the Tunica Intima and progressive formation of the plaque consisting of the core that the fibrous cap. HDL assists in cholesterol efflux and transport to the liver. (b) Diagrammatic representation of the main processes of the atherosclerotic plaque progression (legends as in Fig. 1b).**

{1, Re} and  $K$  is the medium Darcian permeability. The Womersley parameter can be interpreted as an estimation of the distance from the artery wall where the viscous forces are of equal magnitude to the inertia. This type of N-S equation addresses time-periodic pressure gradient driving the Poiseuille flow.

Mass transfer of LDL in the blood vessel is coupled with the blood flow N-S equation and is modeled by the general form of the advection-diffusion equation

$$\frac{\partial c}{\partial t} + \nabla \cdot (-D\nabla c + Vc) = 0 \tag{4}$$

where  $c$  is the average solute concentration in the blood, and  $D$  is the solute diffusivity and the Eulerian approach is followed.

In the case of the modified N-S equation mass transfer in the lumen is described with an advection-diffusion equation with Womersley parameter<sup>94</sup>:



$$\alpha^2 \frac{\partial c}{\partial t} + \text{Re} \mathbf{u} \cdot \nabla c - \frac{1}{Sc} \nabla^2 c = 0 \quad (5)$$

where  $c$  is the non-dimensional species concentration and  $Sc$  is the Schmidt number. An alternative non-dimensionalisation employing the Péclet number ( $Pe$ ) can be used<sup>26</sup> considering that  $Pe = \text{Re} \cdot Sc$ . Mass in the wall is described by the following non-dimensional equation

$$\alpha^2 \frac{\partial c}{\partial t} + \text{Re}_{\text{eff}} \mathbf{u} \cdot \nabla c + \text{Re}_{\text{eff}} H c - \frac{1}{Sc_{\text{eff}}} \nabla^2 c = 0 \quad (6)$$

$Sc_{\text{eff}}$  is the effective Schmidt number given as  $Sc_{\text{eff}} = v/D_{\text{eff}}$ ,  $D_{\text{eff}}$  is the effective diffusivity of species in the wall,  $\text{Re}_{\text{eff}}$  is the effective Reynolds number given as  $\text{Re}_{\text{eff}} = B^* \text{Re}$  and  $H$  is a normalized first order reaction rate for species binding and degradation by the cells of the media and  $B$  is a measure of the interactions between the transported species and the wall components.<sup>94</sup>

#### LDL Infiltration Across the Arterial Wall

The endothelium permeability of the arterial wall is shear stress depended. Due to the blood flow, a frictional force is exerted on the arterial wall, i.e. the wall shear stress (WSS), given by the following equation:

$$\tau_w = \mu \left. \frac{\partial u}{\partial r} \right|_{\text{wall}} \quad (7)$$

where  $\tau_w$  is the WSS,  $\mu$  is the dynamic viscosity of the fluid,  $u$  is the fluid velocity along the boundary and  $r$  is the radial distance from the boundary (the wall). The interconnection between the endothelial transport properties and WSS is expressed by the endothelial cell shape index function ( $SI$ ), where a portion of the cells will behave as leaky cells ( $\varphi$ ) enhancing the endothelium permeability to LDL.<sup>25,99</sup> The amount of LDL and leaky cells determine the transport conditions of the porous model in the lumen.<sup>7,18,70,100</sup> However, in the near-wall region, the WSS also affects the local transport of atherogenic biochemicals from the fluid towards the tissue.<sup>6</sup> In addition, the LDL mass transfer can be affected by the artery movement.<sup>54</sup>

**Arterial Tissue as Porous Medium** The arterial wall can be treated as a porous medium composed of dispersed cells separated by connective voids where blood flows.<sup>51</sup> The Darcy Law, the Darcy–Forchheimer model, the Brinkman model, the Vafai and Tien, and the Brinkman–Forchheimer–Darcy equation are amongst the transport models that have been proposed to describe the biological phenomena.<sup>50</sup>

The Darcy law represents a linear relationship between the flux and the pressure gradient across the porous medium:

$$q = -\frac{k}{\mu} \nabla p \quad (8)$$

where  $k$  is the permeability tensor,  $q$  is the flux,  $\mu$  the dynamic viscosity, and  $\nabla p$  is the pressure gradient. The fluid velocity  $u$  is related to the flux through the porosity  $\varphi$ :

$$u = \frac{q}{\varphi} \quad (9)$$

Darcy–Forchheimer model is a modified model to account for the inertial effects based on a permeability-based Reynolds number and is defined as:

$$\nabla p = -\frac{\mu}{K} V + c_F K^{-1/2} \rho |V| V \quad (10)$$

where  $c_F$  is a dimensionless parameter related to inertial effects. The permeability-based Reynolds number for the transition to the Darcy–Forchheimer model is defined as:

$$\text{Re}_K = \frac{u_p \sqrt{K}}{v} \quad (11)$$

where  $u_p$ ,  $K$ , and  $v$  are the pore velocity, permeability, and kinematic viscosity, respectively. Brinkman's model takes into account porous medium solid walls and introduces no-slip boundary conditions and is given by:

$$\nabla p = -\frac{\mu}{K} V + \mu_e \nabla^2 V \quad (12)$$

where  $\mu_e$  is the effective viscosity of the porous medium. In both Darcy and Brinkman transport models the advection–diffusion Eq. (4) can be implemented.

Vafai and Tien<sup>101</sup> proposed a generalized volume averaged model of the expanded Brinkman equation for flow transport through porous media defined as:

$$\begin{aligned} \frac{\rho_f}{\varepsilon} \left[ \frac{\partial V}{\partial t} + \langle (V \cdot \nabla) V \rangle \right] &= -\nabla \langle P \rangle^f + \frac{\mu}{\varepsilon} \nabla^2 \langle V \rangle - \frac{\mu}{K} \langle V \rangle \\ &\quad - \frac{\rho_f F \varepsilon}{K^{1/2}} [\langle V \rangle \cdot \langle V \rangle] J \end{aligned} \quad (13)$$

where  $\varepsilon$  is the medium porosity,  $F$  and  $\rho_f$  are the dimensionless inertia coefficient and the fluid density, respectively. The parameters  $\langle P \rangle^f$  and  $J$  are the average pressure inside the fluid and a unit vector pointing along the velocity vector  $V$ , respectively. The symbol  $\langle \cdot \rangle$ , represents the local volume average of a quantity associated with the fluid. In this case species transport is described by the advection–diffusion Eq. (4).

A more detailed model to address transport processes within the arterial layers was proposed by Prosi *et al.*<sup>74</sup>

$$\frac{\partial \langle c \rangle}{\partial t} + \nabla \cdot \left( -D \nabla \langle c \rangle + \frac{\gamma}{\varepsilon} \langle V \rangle \langle c \rangle \right) + k \langle c \rangle = 0 \quad (14)$$

where  $\gamma$  is the hindrance coefficient for the transport of species and  $k$  is the reaction rate constant.

Finally, an extensive model to describe LDL transport in each arterial layer namely the endothelium, intima, IEL and media, comprises of the following set of volume-averaged equations for the fluid flow and the species transportation was employed for the endothelium and IEL:

$$\frac{\rho}{\varepsilon} \frac{\partial \langle V \rangle}{\partial t} + \frac{\mu}{K} \langle V \rangle = -\nabla \langle p \rangle^f + R_u T \sigma_d \nabla c + \mu' \nabla^2 \langle V \rangle \quad (15)$$

$$\frac{\partial \langle c \rangle}{\partial t} + (1 - \sigma_f) \langle V \rangle \cdot \nabla \langle c \rangle = D_c \nabla^2 \langle c \rangle \quad (16)$$

and for the intima and media layers

$$\frac{\rho}{\varepsilon} \frac{\partial V}{\partial t} + \frac{\mu}{K} V = -\nabla p^f + \mu' \nabla^2 V \quad (17)$$

$$\frac{\partial \langle c \rangle}{\partial t} + (1 - \sigma_f) \langle V \rangle \cdot \nabla \langle c \rangle = D_c \nabla^2 \langle c \rangle + k \langle c \rangle \quad (18)$$

where  $\mu'$  the effective dynamic viscosity,  $\sigma_f$  is the Staverman filtration reflection coefficient,  $\sigma_d$  is the Staverman osmotic reflection coefficient,  $T$  is the absolute temperature, and  $R_u$  is the universal gas constant. It can be seen that for the IEL and endothelium the Staverman filtration and osmotic reflection coefficients, associated to the permeability of the membranes to solutes such as LDL, are incorporated in the corresponding equations.<sup>104</sup>

*Arterial Tissue as Membrane* In order to resolve the cell membrane permeability characteristics, correlations for the transmural velocity ( $J_v$ ) and the solute flux ( $J_s$ ) at the lumen–wall interface are used. These are the Kedem–Katchalsky (K–K) equations given by

$$J_v = L_p (\Delta p - \sigma \Delta \pi) \quad (19)$$

$$J_s = \omega \Delta \pi + (1 - \sigma) J_v \bar{c} \quad (20)$$

where  $L_p$  is the hydraulic permeability,  $\Delta p$  is the pressure difference and  $\Delta \pi$  is the osmotic pressure difference between the semipermeable membrane sides,  $\omega$  is the solute permeability coefficient,  $\sigma$  is the reflection coefficient and  $\bar{c}$  is the mean solute concentration of endothelium.<sup>48</sup>

Another expression of the K–K equations to describe the flux across the endothelium and IEL incorporates the Staverman reflection coefficients and is given by<sup>47</sup>:

$$J_v = L_p (\Delta p - \sigma_d \Delta \pi) \quad (21)$$

$$J_s = P \Delta c + (1 - \sigma_f) J_v \bar{c} \quad (22)$$

The permeability coefficient of the wall layer is  $P$  whereas  $\Delta c$  is the osmotic concentration difference. The Staverman osmotic reflection coefficient  $\sigma_d$  denotes the ability of a solute to induce osmotic flow in the sense that if a membrane can have pores so small as to completely exclude the solute or so large that the solute completely passes through then the full ( $\sigma_d = 1$ ) or null ( $\sigma_d = 0$ ) osmotic potential respectively is realized. The Staverman filtration reflection coefficient  $\sigma_f$ , denotes the ability of a membrane to sieve a solute in a filtration in the sense that  $\sigma_f = 1$  if the solute is completely excluded and  $\sigma_f = 0$  if the membrane is unselective.<sup>10</sup> Albeit some studies consider  $\sigma_d$  and  $\sigma_f$  as equal<sup>3,49,104</sup> others suggest non-equal values for  $\sigma_d$  and  $\sigma_f$  for both the endothelium and IEL.<sup>46</sup> In addition to the latter, Shu *et al*<sup>87</sup> argue that the assumption that coefficients  $\sigma_d$  and  $\sigma_f$  in the classical K–K equations are equal cannot be valid for osmosis in the nanoscale. Therefore, they propose a modified version incorporating three new parameters, namely the osmotic pressure coefficient ( $\sigma_o$ ), the primary filtration coefficient ( $\sigma_s$ ) and the secondary selectivity rate ( $x$ ), instead of the two coefficients, that is given by

$$J_v = L_p (\Delta P - \sigma_o \pi) \quad (23)$$

$$J_s = \omega L_p \Delta \pi + x (1 - \sigma_s) c J_v \quad (24)$$

Thereby Eqs. (23) and (24) are able to accurately take into account the osmosis through nano-pores.

Traditional Kedem–Katchalsky membrane equations have two major disadvantages. First, a steady-state condition is considered in the endothelium and the IEL. Second, the boundary effects on the flow across the membrane are ignored, which is not valid when the boundaries of the porous membrane have to be accounted for.<sup>50</sup> For this reason a modified version of Kedem–Katchalsky's equations for the solute flux through the endothelium has been presented:

$$J_s = P (c_{\text{lum}} - c_{\text{w, end}}) \frac{P_e}{e^{Pe} - 1} + J_v (1 - \sigma) c_{\text{lum}} \quad (25)$$

$$Pe = \frac{J_v (1 - \sigma)}{P_i} \quad (26)$$

where  $P$  is the diffusive permeability,  $Pe$  is the modified Péclet number,  $c_{\text{w, end}}$  the LDL concentration in the arterial wall at the sub-endothelial layer, and  $\sigma$  is the solvent drag coefficient.<sup>73</sup>

The flux of fluid and solutes within biological membranes considering osmotic pressure and active transport mechanisms and the alteration of their ionic distribution due to their charges has been described by an enhanced K–K set of equations as:

$$J_v = L_p \left( \Delta P - \sum_k (\sigma_k RT \Delta C_k - (1 - \sigma_k) z_k F \bar{C}_k \Delta \phi) \right) \quad (27)$$

$$J_i = (1 - \sigma_i) J_v \bar{C}_i + \omega_i (RT \Delta C_i + z_i \bar{C}_i F \Delta \phi) \quad (28)$$

where  $z_k$  is the charge number of species  $k$ ,  $F$  is the Faraday constant and  $\Delta\phi$  is electrical potential difference, whereas summation denotes a variety of solutes.<sup>17</sup> The enhanced K–K equations can fill the gap of the traditional version of K–K theory regarding the recovery of the Donnan equilibrium where fixed charges induce imbalance of ionic concentrations and develop an osmotic pressure gradient between the inside and outside environments of the membrane. An additional term  $J_{ai}$  can be added at the RHS of Eq. (28) accounting for the active ionic transport. The work of Cheng and Pinsky<sup>17</sup> is a step forward compared to previous studies of Li<sup>56</sup> that incorporated the electrostatic potential difference between solutes, yet not able to address the Donnan equilibrium or the work of Hodson and Earlam<sup>43</sup> using the K–K theory with fixed charges but only for binary solutions and not for active transport.

**Fluid-Wall Models and Boundary Conditions** In general, numerical models of LDL mass transfer in the arterial wall have been classified into three distinct types, i.e. the wall free model, the fluid-wall single layer model and the fluid-wall multilayer model.<sup>74</sup> The pertinent boundary conditions for fluid and solute for the different arterial transport models are described as follows.

In the wall free model, the solution of the blood flow in the lumen is independent of the mass transport mechanism within the artery wall, thus only considering the necessary boundary conditions, i.e. for instance filtration velocity value from the literature, for the wall effect. In this sense the wall-free model does not address solute concentration within the wall. For the wall-free model at the flow entrance a constant filtration velocity is prescribed and for the solute diffusive flux is used at the wall.<sup>76</sup>

The homogenous wall model is the first to address LDL transport to the arterial wall. For the homogenous wall model at the lumen inlet and outlet an “insulation” condition is used. A lumen to wall transmural velocity in the normal direction of the endothelium wall side is used. At the media-adventitia interface a pressure condition was assumed. For the solute convection–diffusion equation constant concentration and a convective flux condition were assumed at the lumen inlet and outlet. At the wall side of the endothelium a flux in the normal direction is

used. Finally, a constant concentration is used at the media-adventitia interface.<sup>96</sup>

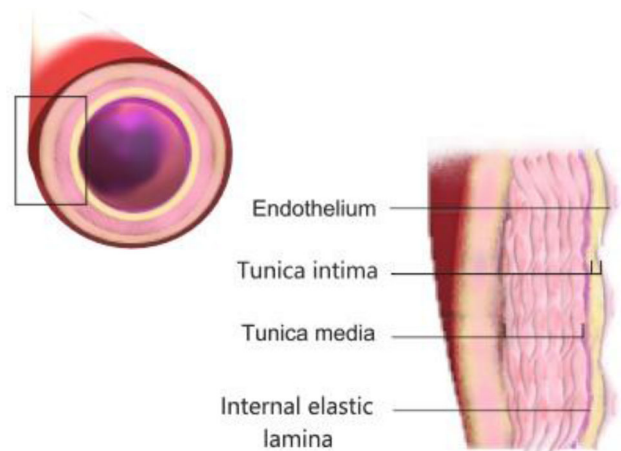
The fluid-wall multi-layer model is a very comprehensive model incorporating the wall heterogeneity considering distinctively the different properties of each arterial layer either as a membrane or as a porous medium.<sup>50</sup> A version of this model is the four-layer model<sup>104</sup> where the endothelium, intima, internal elastic lamina (IEL) and media are all treated as macroscopically homogeneous porous media employing Eqs. (15)–(18). The solid boundaries effects of the different porous layers are neglected. The hydraulic pressure at the lumen-endothelium and the media-adventitia interfaces are 100 mmHg. The reference filtration velocity is taken as  $2.31 \times 10^{-5} \text{ mm}\cdot\text{s}^{-1}$ . Continuity of velocity is applied at the lumen-endothelium-intima-IEL-media interfaces. For the solute concentration a total mass flux boundary condition is applied at the endothelium-intima-IEL-media interfaces. At the lumen-endothelium interface net transmural flux is used. Between the media and adventitia, the boundary condition applied is  $\partial c/\partial n = 0$ . In the work of Yang and Vafai<sup>105</sup> analytical solutions for LDL transport in the arterial wall are presented but their use is limited to straight geometry.

The basic layers of the artery wall are shown in Fig. 3, whereas the pertinent mass transfer models and the corresponding boundary conditions are summarized in Tables 1 and 2 respectively.

### Atherosclerosis Inflammatory Processes

#### LDL Oxidation and the Role of HDL

Oxidation of LDL was first modelled by Stanbro<sup>93</sup> using an ordinary differential equation (ODE) and later on Cobbold *et al.*<sup>20</sup> proposed a system of time-



**FIGURE 3.** Arterial wall cross-section. Widths of layers pertinent to modelling are Endothelium— $2 \mu\text{m}$ , Tunica intima— $10 \mu\text{m}$ , IEL— $2 \mu\text{m}$ , Tunica media— $200 \mu\text{m}$ .<sup>49</sup>

TABLE 1. Summary of mass transfer models of fluid and solute in the lumen and the arterial wall.

	Lumen		Wall			
			Porous media		Membrane	
	Reference	Equations	Reference	Equation	Reference	Equation
Fluid	Stangeby and Ethier <sup>94</sup>	(1)–(3)	Khakpour and Vafai <sup>50</sup>	(8), (10), (12)	Kedem and Katchalsky <sup>48</sup>	(19)
	Khakpour and Vafai <sup>50</sup>		Vafai and Tien <sup>101</sup>	(13)	Shu <i>et al.</i> <sup>87</sup>	(23)
Solute		(4), (5)	Yang and Vafai <sup>104</sup>	(15), (17)	Cheng and Pinsky <sup>17</sup>	(27)
			Stangeby and Ethier <sup>94</sup>	(6)	Kedem and Katchalsky <sup>48</sup>	(20)
			Prosi <i>et al.</i> <sup>74</sup>	(14)	Shu <i>et al.</i> <sup>87</sup>	(24)
			Yang and Vafai <sup>104</sup>	(16), (18)	Patlak <i>et al.</i> <sup>73</sup>	(25)
				Cheng and Pinsky <sup>17</sup>	(28)	

dependent ODEs based on *in vitro* experimental data. A second order kinetic reaction was used to model the interaction between LDL and free radicals. Calvez and Ebde<sup>12</sup> proposed an improved version of this approach to describe the evolution of the oxLDL ( $Ox$ ) concentration and the subsequent transformation of macrophages into foam cells. In their PDE the second term at the left-hand side represents the lesion growth indicating that the  $Ox$  molecules are transported along with the tissue deformation having velocity  $u$ . The same model was used by Silva *et al.*<sup>89</sup> A similar approach was frequently used, where synthesis and turnover of oxLDL were modelled as a reaction with radicals.<sup>12,19,32,34,36,42,78,89</sup> On the other hand, a simplified approach was proposed by Cohen *et al.*<sup>21</sup> considering LDL oxidation as a constant. The works of Friedman and Hao<sup>34</sup> and Hao and Friedman<sup>42</sup> expanded the original model and incorporated the impact of the HDL concentration. In their analysis HDL reacts with free radicals and oxidates. Table 3 summarises the governing equations used in LDL oxidation.

#### MCP-1 Secretion

The response of the endothelial cells in the presence of ox-LDL is the secretion of MCP-1 that initiates the monocytes recruitment into the intima.

Hao and Friedman<sup>42</sup> included MCP-1 production by the endothelial cells assuming a constant concentration.<sup>79</sup> Production, diffusion and degradation rate of MCP-1 were set according to Chen *et al.*<sup>15</sup> In the work of McKay *et al.*<sup>64</sup> the evolution of monocytes concentration was modeled using a differential equation considering the effect of chemo-attractants and the subsequent proliferation and the formation of macrophages. Monocytes production rate, maturing rate into macrophages, and the proliferation rate were necessary parameters for the modelling. In the model of Cilla *et al.*<sup>19</sup> a diffusion-convection differential

equation was used incorporating production and degradation of MCP-1. In their study diffusion and convection terms were disregarded. Cytokines production and degradation rates were set according to Siogkas *et al.*<sup>90</sup> and Zhao *et al.*,<sup>109</sup> and the threshold of LDL and monocytes mitosis as in Schwenke and Carew.<sup>83</sup> In other studies, the secretion of MCP-1 was grouped together with other chemoattractants such as interleukin-1 (IL-1) and M-CSF.<sup>31,45,64,89,108</sup> A summary of the governing equations used in the secretion of monocyte chemoattractant protein is presented in Table 4.

#### Monocyte Recruitment

The existence of monocytes in the lumen has rarely been considered. Cilla *et al.*<sup>19</sup> presented monocyte dispersion process along the lumen and in the intima. Similar approaches for the monocyte diffusion in the wall have also been proposed.<sup>11,64</sup> Chalmers *et al.*<sup>13</sup> included monocyte chemoattractant flux into the intima. Monocyte production in the endothelial cells was determined as a function of cytokine and modified LDL concentration. The transport of monocytes through the intima-media domain has been modeled as a purely diffusion–reaction equation. In other studies a system of reaction–diffusion PDEs describing the density of immune cells (monocytes, macrophages) and the density of the cytokines secreted by the immune cells has been proposed.<sup>52,53</sup> In other studies, the monocyte recruitment and differentiation has been simplified and incorporated into the governing equation of the macrophage density describing the conversion of macrophages into foam cells after reaction with oxLDL.<sup>12,32,89,99</sup> Monocytes concentration in the intima could be either incorporated as a constant value<sup>32</sup> or a function of a pro-inflammatory signal  $S$ .<sup>89</sup> The governing equations used in monocyte recruitment are summarized in Table 5.



TABLE 2. Boundary conditions for mass transfer models of the arterial wall with  $u$ ,  $p$  and  $c$  the fluid velocity, pressure and LDL concentration respectively.

	Wall-free model	Fluid-Wall single-layer model	Fluid-wall multi-layer model	
	<p>lumen</p> <p><math>c_l</math></p> <p><math>p_l</math></p> <p><math>u_l</math></p> <p>outer boundary (arterial wall)</p> <p><math>c_w</math></p> <p><math>p_w</math></p> <p><math>u_w</math></p>	<p>lumen</p> <p><math>c_l</math></p> <p><math>p_l</math></p> <p><math>u_l</math></p> <p>intima/media</p> <p><math>c_m</math></p> <p><math>p_m</math></p> <p><math>u_m</math></p> <p>outer boundary (adventitia)</p> <p><math>c_{adv}</math></p> <p><math>p_{adv}</math></p> <p><math>u_{adv}</math></p>	<p>lumen</p> <p><math>c_l</math></p> <p><math>p_l</math></p> <p><math>u_l</math></p> <p>endothelium</p> <p><math>c_e</math></p> <p><math>p_e</math></p> <p><math>u_e</math></p> <p>i.e.l.</p> <p>intima</p> <p><math>c_i</math></p> <p><math>p_i</math></p> <p><math>u_i</math></p> <p>media</p> <p><math>c_m</math></p> <p><math>p_m</math></p> <p><math>u_m</math></p> <p>outer boundary (adventitia)</p> <p><math>c_{adv}</math></p> <p><math>p_{adv}</math></p> <p><math>u_{adv}</math></p>	<p>Interface 1<sup>105</sup></p> <p>Interface 2-4<sup>105</sup></p> <p>Interface 5<sup>102,104,105</sup></p> <p>Interface 1-4<sup>102,104,105</sup></p> <p>Interface 5<sup>102,104,105</sup></p>
Boundary conditions				
Fluid	Interface <sup>28,68,75</sup> $u_{fit} = \text{const}$	Interface 1 <sup>70,81,94,96</sup> $n_w \cdot u_w = -J_y$		$p = 100 \text{ mmHg}, \frac{\partial u_m}{\partial n} = 0$
Solute	Interface <sup>28,68,75</sup> $q_w = -D \frac{\partial c}{\partial n} = \alpha c_w$	Interface 2 <sup>70,81,94,96</sup> $p_w = p_{adv}, \frac{\partial u}{\partial n} = 0$		$\frac{\partial u_m}{\partial n} = 0$
		Interface 1 <sup>70,81,94,96</sup> $(-D) \nabla c_l + u_l c_l \cdot n_l = J_s$		$p = 30 \text{ mmHg}, \frac{\partial u_m}{\partial n} = 0$
		Interface 2 <sup>70,81,94,96</sup> $(-D_w \nabla c_w + u_w c_w) \cdot n_w = J_s$		$[(1 - \sigma_t) V_c - D_e \frac{\partial c}{\partial n}]_+ = [(1 - \sigma_r) V_c - D_e \frac{\partial c}{\partial n}]_-$
				$c/C_0 = 0 \text{ or } c/C_0 = 0.01 \text{ or } \partial c / \partial n = 0$

TABLE 3. Summary of the governing equations used in LDL oxidation.

Reference	Governing equations	
Calvez and Ebde, <sup>12</sup> Silva et al. <sup>89</sup>	$\begin{cases} \partial_t Ox + div(uOx) = d_1 \Delta Ox - k_1 Ox \cdot M, & \text{for all } (x, y) \\ \partial_y Ox = \tau(x)C, & \text{if } y = h \\ \partial_y Ox = 0, & \text{if } y = 0 \end{cases}$	<p>Ox: LDL concentration  <math>10^{-3} \text{ cm}^2 \cdot \text{s}^{-1}</math>  <math>1 \text{ cm} \cdot \text{g}^{-1} \cdot \text{s}^{-1}</math></p> <p><math>M</math>: Macrophages concentration  <math>C</math>: LDL concentration  <math>\tau(x)</math>: Blood vessel permeability</p>
Gessaghi et al. <sup>36</sup>	$\begin{cases} \partial_t Ox = km \\ \partial_t Ox = 0 \end{cases}$	<p><math>m</math>: Intimal LDL mass accumulation per unit surface area</p>
Reddy and Seshaiyer <sup>78</sup>	$k \frac{\partial L}{\partial t} = D_L \nabla^2 L - k_L LM + L_0$	<p><math>M</math>: Macrophages concentration rate  <math>L_0</math>: LDL molecule input</p>
Cilla et al. <sup>19</sup>	$\begin{aligned} \frac{\partial C_{LDL,w}}{\partial t} + \nabla \cdot (-D_{LDL,w} \nabla C_{LDL,w}) + u_w \cdot \nabla C_{LDL,w} \\ = -d_{LDL} C_{LDL,w} - LDL_{ox} C_{LDL,w} C_{M,w} \end{aligned}$	<p><math>d_{LDL}</math>: LDL degradation rate  <math>LDL_{ox}</math>: LDL uptake rate by macrophage  <math>C_{M,w}</math>: Macrophages concentration</p>
Hao and Friedman <sup>42</sup>	$\begin{cases} \frac{\partial L}{\partial t} - D_L \Delta L = -k_L rL \\ \frac{\partial H}{\partial t} - D_H \Delta H = -k_H rHG \\ \frac{\partial L_{ox}}{\partial t} - D_{L_{ox}} \Delta L_{ox} = k_L rL - \lambda_{L_{ox}M} ML_{ox} \end{cases}$	<p><math>L</math>: LDL concentration  <math>D_L</math>: LDL diffusion coefficient  <math>k_L</math>: LDL oxidation rate  <math>r</math>: Free radicals concentration  <math>L</math>: LDL distribution  <math>H</math>: HDL distribution  <math>D_H</math>: HDL diffusion coefficient</p>
Friedman and Hao <sup>34</sup>	$\begin{aligned} \frac{\partial H}{\partial t} - D_H \Delta H &= -k_H rH - \frac{k_{AF}}{1+m} KF + F \\ \frac{\partial L_{ox}}{\partial t} - D_{L_{ox}} \Delta L_{ox} &= k_L rL - \lambda_{L_{ox}M_1} \frac{L_{ox}}{K_{L_{ox}} + L_{ox}} \\ &\quad M_1 - \lambda_{L_{ox}M_2} \frac{L_{ox}}{K_{L_{ox}} + L_{ox}} M_2 \end{aligned}$	<p><math>H</math>: HDL concentration  <math>D_H</math>: HDL diffusion coefficient  <math>k_H</math>: Reaction rate of HDL with radical</p> <p><math>L_{ox}</math>: Concentration of ox-LDL  <math>D_{L_{ox}}</math>: Diffusion coefficient of oxidized LDL  <math>K_{L_{ox}}</math>: ox-LDL saturation for production of MCP-1  <math>\lambda_{L_{ox}M_1}</math>: Rate of ox-LDL ingestion by M1 macrophages  <math>\lambda_{L_{ox}M_2}</math>: Rate of ox-LDL ingestion by M2 macrophages  <math>M_1</math>: M1 macrophages density  <math>M_2</math>: M2 macrophages density</p>

**TABLE 4. Summary of the governing equations used in the secretion of monocyte chemoattractant protein.**

Reference	Governing equations
Hao and Friedman <sup>42</sup>	$\frac{\partial P}{\partial t} - D_p \Delta P = \lambda_{PE} \frac{L_{ox}}{K_{L_{ox}} + L_{ox}} - d_p P$ $P:$ MCP-1 concentration $D_p:$ MCP-1 diffusion coefficient $\lambda_{PE}:$ MCP-1 production rate $L_{ox}:$ ox-LDL distribution $K_{L_{ox}}:$ ox-LDL saturation for production of MCP-1
Mckay <i>et al.</i> <sup>64</sup>	$\frac{\partial C}{\partial t} = \rho_C L_{ox} - d_C C$ $C:$ Chemo-attractant density $L_{ox}:$ ox-LDL density $d_C:$ Chemo-attractant degradation
Cilla <i>et al.</i> <sup>19</sup>	$\frac{\partial C_{c,w}}{\partial t} = -d_c C_{c,w} + C_r C_{LDL_{ox,w}} C_{m,w}$ $C_{c,w}:$ Cytokines concentration $d_c:$ Cytokines degradation rate $C_r:$ Cytokines production rate $C_{LDL_{ox,w}}:$ Ox-LDL concentration $C_{m,w}:$ Monocytes concentration
Filipovic <i>et al.</i> <sup>31</sup>	$\partial_t S = d_s \Delta S - \lambda S + k_1 Ox \cdot M + \gamma (Ox - Ox^{thr})$ $S:$ Cytokines concentration $d_s:$ Diffusion coefficient $\lambda:$ Degradation coefficient $k_1:$ Solute lag coefficient $Ox:$ Ox-LDL $M:$ Macrophages concentration $\gamma:$ Ox-LDL detection coefficient

**TABLE 5. Summary of the governing equations used in monocyte recruitment.**

Reference	ions
Cilla <i>et al.</i> <sup>19</sup>	<p>Lumen</p> $\nabla \cdot (-D_{m,l} \nabla C_{m,l}) + u_1 \cdot \nabla C_{m,l} = 0$ $D_m:$ monocyte diffusion coefficient in the lumen $C_{m,l}:$ monocyte concentration in the lumen
Cilla <i>et al.</i> <sup>19</sup>	<p>Wall</p> $\frac{\partial C_{m,w}}{\partial t} + \nabla \cdot (-D_{m,w} \nabla C_{m,w}) = -d_m C_{m,w} - m_d C_{m,w} + C_{m,w} C_{LDL_{ox,w}} \exp\left(\frac{-C_{m,w}^2}{2C_{m,w}^{th}}\right)$ $C_{m,w}:$ Monocytes concentration $d_m:$ Monocytes differentiation rate $m_d:$ Monocytes natural death $C_{LDL_{ox,w}}:$ Ox-LDL $C_{m,w}^{th}:$ Monocytes mitosis threshold
Bulelzai and Dubbeldam <sup>11</sup>	$\frac{dm}{dt} = (\Gamma(\sigma_w, L_{ox}) - d_m)m - \rho_1 m$ $m:$ Monocyte concentration $\sigma_w:$ Wall shear stress $L_{ox}:$ Ox-LDL $d_m:$ Monocyte diffusion $\rho_1:$ Monocytes differentiation
Mckay <i>et al.</i> <sup>64</sup>	$\frac{dm}{dt} = \rho_m C + (\mu - \rho_m)mP$ $m:$ Monocytes density $\rho_m:$ Monocyte production/influx $C:$ Chemo-attractant density $\mu:$ Monocyte proliferation/differentiation $P:$ Proliferation factor density
El Khatib <i>et al.</i> <sup>52,53</sup> Ougrinovskaia <i>et al.</i> <sup>71</sup>	$\begin{cases} \frac{\partial M}{\partial t} = d_1 \frac{\partial^2 M}{\partial x^2} + f_1(A) - \lambda_1 M \\ \frac{\partial A}{\partial t} = d_2 \frac{\partial^2 A}{\partial x^2} + f_2(A)M - \lambda_2 A \end{cases}$ $M:$ Immune cells density $A:$ Cytokines density $f_1(A):$ Immune cells recruitment $f_2(A)M:$ Cytokines production rate $\lambda_1 M:$ Immune cells degradation $\lambda_2 A:$ Cytokines degradation
Filipovic <i>et al.</i> <sup>32</sup>	$\partial_t O = d_1 \Delta O - k_1 O \cdot M$ $O:$ Ox-LDL $d_1:$ Diffusion coefficient $k_1:$ Solute lag coefficient $M:$ Macrophages concentration in the intima
Chalmers <i>et al.</i> <sup>13</sup>	$\frac{\partial p}{\partial t} = D_p \frac{\partial^2 p}{\partial x^2} + \mu_p \frac{lm}{1+l} - d_p p$ $p:$ Chemoattractant concentration $D_p:$ Chemoattractant diffusion $\mu_p:$ Macrophages conversion rate $l:$ modLDL density $m:$ Macrophages density

### Monocyte to Macrophage Differentiation

Macrophage formation after taking up oxLDL is described by a reaction term.<sup>78</sup> The evolution of

oxLDL and the transformation of monocytes to macrophages were incorporated in the work of Calvez and Ebde<sup>12</sup> and Silva *et al.*<sup>89</sup> It was assumed that all monocytes would differentiate into macrophages once

**TABLE 6. Summary of the governing equations used in monocyte to macrophage differentiation.**

Reference	Governing equations	
Reddy and Seshaiyer <sup>78</sup>	$\begin{cases} \frac{\partial M}{\partial t} + \nabla \cdot (\mu M \nabla L) = D_M \nabla^2 M - k_M LM + f(L) \\ \frac{\partial N}{\partial t} = k_M LM - k_N N \end{cases}$	$k_M$ : Macrophages reaction rate $f(L)$ : Macrophage influx $N$ : Necrotic lipids concentration $k_N$ : Plaque destruction rate
Calvez and Ebde <sup>12</sup>	$\partial_t M + \text{div}(vM) = d_2 \Delta M - k_1 Ox \cdot M$	$k_1$ : Macrophage creation term $Ox$ : Ox-LDL density
Cilla <i>et al.</i> <sup>19</sup>	$\frac{\partial C_{m,w}}{\partial t} + \nabla \cdot (-D_{m,w} \nabla C_{m,w}) = d_m C_{m,w} - \frac{M_{r1}}{M_{r2}} LDL_{oxr} C_{m,w} C_{LDL_{ox},W}$	$M_{r2}$ : Foam cell formation $LDL_{oxr}$ : Ox-LDL uptake $C_{LDL_{ox},W}$ : Ox-LDL
Hao and Friedman <sup>42</sup>	$\frac{\partial M}{\partial t} + \nabla \cdot (uM) - D_M \Delta M = -\nabla \cdot (M \chi_C \nabla P) + \lambda_{Ml} M \frac{l}{1+Kl} - d_M M$	$P$ : MCP-1 density $\lambda_{Ml}$ : Activation rate of macrophages $l$ : IFN-c concentration $d_M$ : Macrophage death rate
Tomaso <i>et al.</i> <sup>99</sup>	$M_0 = k_c \cdot r_w \cdot c_w$	$r_w$ : LDL degradation rate
Chalmers <i>et al.</i> <sup>13</sup>	$\frac{\partial m}{\partial t} = D_m \frac{\partial^2 m}{\partial x^2} - \chi_m \frac{\partial}{\partial x} (m \frac{\partial l}{\partial x}) - \mu_m \frac{lm}{1+l} + \theta v_N \frac{hN}{\kappa+h} - d_m m$	$\theta$ : Foam cell proportion transformed to macrophages $v_N$ : Foam cell flux $h$ : HDL density $N$ : Foam cell density $\kappa$ : HDL saturation constant

inside the arterial wall and the recruitment of new monocytes depends on a general pro-inflammatory signal  $S$ . Based on the hypothesis that macrophages are relatively free to travel inside the tissue, their convection is much smaller than their diffusion. Cilla *et al.*<sup>19</sup> used a diffusion equation to describe the evolution of macrophages including foam cells apoptosis. The macrophages diffusion coefficient in the arterial wall was equal to the monocyte diffusion coefficient. A similar approach was followed in other studies.<sup>31,45,53</sup> A slightly more complicated expression was proposed by Hao and Friedman<sup>42</sup> including both chemotaxis due to MCP-1 and activation of macrophages due to IFM- $\gamma$ . Tomaso *et al.*<sup>99</sup> used a constant source to model monocyte penetration through the endothelium based on previous work Tedgui and Lever,<sup>98</sup> assuming all monocytes differentiate into macrophages. Finally, Chalmers *et al.*<sup>13</sup> assumed that only a proportion of macrophages convert to foam cells and a proportion ( $\theta$ ) of foam cells revert to macrophages due to the presence of HDL. Table 6 recaps the governing equations used in monocyte to macrophage differentiation.

### Foam Cell Formation and Accumulation

Calvez and Ebde<sup>12</sup> mathematically described foam cell production through a simple mass action law disregarding foam cell diffusion due to their relatively large size. In their work SMCs and fibers contribution to the inflammation is neglected, thus no reaction term was included in the biomass transport equation. Cilla *et al.*<sup>19</sup> modeled macrophages apoptosis using a reaction term along with no-flux boundary conditions at the artery walls, and a similar approach was presented by Tomaso *et al.*<sup>99</sup> Hao and Friedman<sup>42</sup> also modeled the production and death of foam cells using a PDE. In the work of Chalmers *et al.*<sup>13</sup> the inflammation procedure was modeled including cytokine production after macrophages take up ox-LDL. In addition to the foam cell formation, the non-inflammatory process was also included due to the presence of HDL and the subsequent removal of the lipid core.

A transport equation was used by Yang *et al.*<sup>106</sup> for macrophages motion in the vessel wall with a reaction term representing the foam cells formation. In addition



TABLE 7. Summary of the governing equations used in foam cell formation and accumulations.

Reference	Governing equations			
Calvez and Ebde <sup>12</sup>	$\partial_t F + \text{div}(vF) = k_1 Ox \cdot M$			
	$F$ :	Foam cells density	$Ox$ :	Ox-LDL density
	$v$ :	Monocyte displacement speed	$M$ :	Macrophages density
	$k_1$ :	Macrophage creation term		
Cilla <i>et al.</i> <sup>19</sup>	$\frac{\partial C_{F,w}}{\partial t} = \frac{M_{r1}}{M_{r2}} LDL_{oxr} C_{m,w} C_{LDL_{ox},w}$			
	$C_{F,w}$ :	Foam cells concentration	$LDL_{oxr}$ :	Ox-LDL uptake
	$M_{r1}$ :	Ox-LDL to foam cell	$C_{m,w}$ :	Monocytes concentration
	$M_{r2}$ :	Foam cell formation	$C_{LDL_{ox},w}$ :	Ox-LDL diffusion
Hao and Friedman <sup>42</sup>	$\frac{\partial F}{\partial t} + \nabla \cdot (uF) - D_F \Delta F = \lambda_{FM} \frac{L_{ox}}{K_{L_{ox}} + L_{ox}} M - d_F F$			
	$F$ :	Foam cells density	$L_{ox}$ :	ox-LDL density
	$u$ :	Cells common velocity	$K_{L_{ox}}$ :	ox-LDL saturation for production of MCP-1
	$D_F$ :	Foam cells diffusion coefficient	$M$ :	Macrophages density
	$\lambda_{FM}$ :	Foam cells activation rate	$d_F$ :	Foam cell death rate
Chalmers <i>et al.</i> <sup>13</sup>	$\frac{\partial N}{\partial t} = D_N \frac{\partial^2 N}{\partial x^2} + \mu_m \frac{Im}{1+l} - v_N \frac{hN}{\kappa+h}$			
	$N$ :	Foam cell density	$m$ :	Macrophages density
	$D_N$ :	Foam cells random movement	$v_N$ :	Foam cell flux
	$\mu_m$ :	Macrophages conversion rate	$h$ :	HDL density
	$l$ :	modLDL density	$\kappa$ :	HDL saturation constant
Yang <i>et al.</i> <sup>106</sup>	$\frac{\partial c_s^*}{\partial t} + \text{div}(c_s^* v_s) = f_s^r$			
	$c_s^*$ :	Foam cells concentration	$f_s^r$ :	Foam cells production rate
	$u_s$ :	Vessel wall velocity		
Bulelzai and Dubbeldam <sup>11</sup>	$\frac{dF}{dt} = \frac{\rho_{in} L_{ox}}{1 + L_{ox}/L_{in}} M$			
	$F$ :	Foam cells concentration	$L_{ox}$ :	Ox-LDL concentration
	$\rho_{in}$ :	$1.15 \times 10^{-6} \text{ s}^{-1}$	$M$ :	Macrophage concentration

tion, a balance equation for the macrophage accumulation was used. A key feature of the model is that the mechanical properties of the plaque change as a result of foam cells concentration. Moreover, a linear dependence of the reaction function on the macrophages concentration and the growth function on the reaction rate was assumed.

Bulelzai and Dubbeldam<sup>11</sup> presented their model regarding the formation of foam cells following ox-LDL uptake by macrophages. The proposed model adopts similar approaches as in previous studies.<sup>21,71</sup> Ougrinovskaia *et al.*<sup>71</sup> proposed a model neglecting small time-scale events for the lesion development without incorporating cap formation. In their work qualitative properties of the lesions instead of specific concentration of the different factors were adopted. Michaelis–Menten kinetics were used for ox-LDL uptake by macrophages. Another common point is the use of a sigmoidal function for the saturating uptake rate. Cohen *et al.*<sup>21</sup> model studied the HDL effect in atherosclerosis, nevertheless, the rest of the equations were the same as in Ougrinovskaia *et al.*<sup>71</sup> A synopsis of the governing equations used in foam cell formation and accumulations is tabulated in Table 7.

#### *T Cell Recruitment and the Role of Interferon-Gamma (IFN- $\gamma$ )*

In most studies, the role of T-cells is rarely investigated. A very detailed approach was presented by Hao

and Friedman.<sup>42</sup> In their work, an equation for T-cells density was presented expressing T-cells activation by IL-12. The effect of IL-1 and IL-6, which are produced by macrophages and SMCs, was also taken into consideration. In addition, the IFN- $\gamma$  production related to T-cells and the subsequent degradation, as well as the concentration of interleukin-12, were modeled. In their work values of all necessary parameters are tabulated. A similar approach was adopted by Friedman and Hao<sup>34</sup> in their model for reverse cholesterol transport impact. Table 8 summarises the governing equations used in T cell and IFN- $\gamma$  recruitment.

#### *Proliferation of SMCs*

Another scarcely studied factor is the role of the SMCs in atherosclerosis.

A detailed study of the role of SMCs was presented by Hao and Friedman<sup>42</sup> considering the PDGF secretion by SMCs amongst other cells, ECM remodelling due to the matrix metalloproteinase (MMP) and tissue inhibitor of metalloproteinase (TIMP) produced by SMCs amongst other cells. A set of complementary reaction–diffusion equations for the formation of PDGF, MMP, and TIMP was presented. Values of the parameters used in the simulations were derived from the literature.

In contrast, Cilla *et al.*<sup>19</sup> neglected diffusion and convection terms of the differential equation of SMCs behavior due to their large size and because

**TABLE 8. Summary of the governing equations used in T cell and IFN- $\gamma$  recruitment.**

Reference	Governing equations																																
Hao and Friedman <sup>42</sup>	$\begin{cases} \frac{\partial T}{\partial t} + \nabla \cdot (uT) - D_T \Delta T = \lambda_{T_{H_2}} \frac{M}{K_M + M} I_{H_2} - d_T T \\ \frac{\partial I_\gamma}{\partial t} - D_{I_\gamma} \Delta I_\gamma = \lambda_{I_\gamma T} T - d_{I_\gamma} I_\gamma \\ \frac{\partial I_{H_2}}{\partial t} - D_{I_{H_2}} \Delta I_{H_2} = \lambda_{H_2 M} \frac{M}{K_M + M} \left(1 + \frac{I_\gamma}{K_{I_2} H + I_\gamma}\right) + \lambda_{H_2 F} \frac{F}{K_F + F} - d_{H_2} I_{H_2} \end{cases}$																																
	<table> <tr> <td><math>T</math>:</td> <td>Density of T cells</td> <td><math>I_\gamma</math>:</td> <td>Concentration of IFN-<math>\gamma</math></td> </tr> <tr> <td><math>u</math>:</td> <td>Cells common velocity</td> <td><math>D_{I_\gamma}</math>:</td> <td>Degradation rate of IFN-<math>\gamma</math></td> </tr> <tr> <td><math>D_T</math>:</td> <td>Diffusion coefficient of T cell</td> <td><math>\lambda_{I_\gamma T}</math>:</td> <td>Production rate of IFN-<math>\gamma</math> by T cells</td> </tr> <tr> <td><math>\lambda_{T_{H_2}}</math>:</td> <td>Activation rate of T cells by IL-12</td> <td><math>D_{I_{H_2}}</math>:</td> <td>Degradation rate of IL-12</td> </tr> <tr> <td><math>M</math>:</td> <td>Macrophages density</td> <td><math>\lambda_{I_\gamma M}</math>:</td> <td>Production rate of IFN-<math>\gamma</math> by Macrophages</td> </tr> <tr> <td><math>K_M</math>:</td> <td>Macrophages saturation</td> <td><math>K_{I_2}</math>:</td> <td>IFN-<math>\gamma</math> saturation for production of IL-12</td> </tr> <tr> <td><math>I_{H_2}</math>:</td> <td>Concentration of IL-12</td> <td><math>H</math>:</td> <td>Concentration of HDL</td> </tr> <tr> <td><math>d_T</math>:</td> <td>Death rate of T cell</td> <td><math>\lambda_{H_2 F}</math>:</td> <td>Production rate of IL-12 by foam cells</td> </tr> </table>	$T$ :	Density of T cells	$I_\gamma$ :	Concentration of IFN- $\gamma$	$u$ :	Cells common velocity	$D_{I_\gamma}$ :	Degradation rate of IFN- $\gamma$	$D_T$ :	Diffusion coefficient of T cell	$\lambda_{I_\gamma T}$ :	Production rate of IFN- $\gamma$ by T cells	$\lambda_{T_{H_2}}$ :	Activation rate of T cells by IL-12	$D_{I_{H_2}}$ :	Degradation rate of IL-12	$M$ :	Macrophages density	$\lambda_{I_\gamma M}$ :	Production rate of IFN- $\gamma$ by Macrophages	$K_M$ :	Macrophages saturation	$K_{I_2}$ :	IFN- $\gamma$ saturation for production of IL-12	$I_{H_2}$ :	Concentration of IL-12	$H$ :	Concentration of HDL	$d_T$ :	Death rate of T cell	$\lambda_{H_2 F}$ :	Production rate of IL-12 by foam cells
$T$ :	Density of T cells	$I_\gamma$ :	Concentration of IFN- $\gamma$																														
$u$ :	Cells common velocity	$D_{I_\gamma}$ :	Degradation rate of IFN- $\gamma$																														
$D_T$ :	Diffusion coefficient of T cell	$\lambda_{I_\gamma T}$ :	Production rate of IFN- $\gamma$ by T cells																														
$\lambda_{T_{H_2}}$ :	Activation rate of T cells by IL-12	$D_{I_{H_2}}$ :	Degradation rate of IL-12																														
$M$ :	Macrophages density	$\lambda_{I_\gamma M}$ :	Production rate of IFN- $\gamma$ by Macrophages																														
$K_M$ :	Macrophages saturation	$K_{I_2}$ :	IFN- $\gamma$ saturation for production of IL-12																														
$I_{H_2}$ :	Concentration of IL-12	$H$ :	Concentration of HDL																														
$d_T$ :	Death rate of T cell	$\lambda_{H_2 F}$ :	Production rate of IL-12 by foam cells																														

**TABLE 9. Summary of the governing equations used in SMCs proliferation.**

Reference	Governing equations																																								
Hao and Friedman <sup>42</sup>	$\begin{cases} \frac{\partial S}{\partial t} + \nabla \cdot (uS) - D_S \Delta S = -\nabla \cdot (S \chi_C \nabla P) - \nabla \cdot (S \chi_C \nabla G) - \nabla \cdot (S \chi_H \nabla \rho) \\ \frac{\partial G}{\partial t} - D_G \Delta G = \lambda_{GM} M + \lambda_{GF} F + \lambda_{GS} S - d_G G \\ \frac{\partial Q}{\partial t} - D_Q \Delta Q = \lambda_{QS} S + d_{QQR} Q - d_Q Q \end{cases}$																																								
	<table> <tr> <td><math>S</math>:</td> <td>SMCs density</td> <td><math>\lambda_{GF}</math>:</td> <td>Production rate of PDGF by foam cells</td> </tr> <tr> <td><math>u</math>:</td> <td>Cells common velocity</td> <td><math>F</math>:</td> <td>Foam cells density</td> </tr> <tr> <td><math>D_S</math>:</td> <td>SMCs diffusion coefficient</td> <td><math>d_G</math>:</td> <td>PDGF degradation rate</td> </tr> <tr> <td><math>\chi_C</math>:</td> <td>Chemotactic sensitivity parameter</td> <td><math>Q</math>:</td> <td>MMPs density</td> </tr> <tr> <td><math>P</math>:</td> <td>MCP-1 density</td> <td><math>D_Q</math>:</td> <td>MMP diffusion coefficient</td> </tr> <tr> <td><math>G</math>:</td> <td>PDGF density</td> <td><math>\lambda_{QS}</math>:</td> <td>Production rate of MMP by SMCs</td> </tr> <tr> <td><math>\rho</math>:</td> <td>ECM density</td> <td><math>d_{QQR}</math>:</td> <td>Binding rate of MMP to TIMP</td> </tr> <tr> <td><math>D_G</math>:</td> <td>PDGF diffusion coefficient</td> <td><math>Q_r</math>:</td> <td>TIMP density</td> </tr> <tr> <td><math>\lambda_{GM}</math>:</td> <td>Production rate of PDGF by macrophages</td> <td><math>d_Q</math>:</td> <td>TIMP degradation rate</td> </tr> <tr> <td><math>M</math>:</td> <td>Macrophages density</td> <td></td> <td></td> </tr> </table>	$S$ :	SMCs density	$\lambda_{GF}$ :	Production rate of PDGF by foam cells	$u$ :	Cells common velocity	$F$ :	Foam cells density	$D_S$ :	SMCs diffusion coefficient	$d_G$ :	PDGF degradation rate	$\chi_C$ :	Chemotactic sensitivity parameter	$Q$ :	MMPs density	$P$ :	MCP-1 density	$D_Q$ :	MMP diffusion coefficient	$G$ :	PDGF density	$\lambda_{QS}$ :	Production rate of MMP by SMCs	$\rho$ :	ECM density	$d_{QQR}$ :	Binding rate of MMP to TIMP	$D_G$ :	PDGF diffusion coefficient	$Q_r$ :	TIMP density	$\lambda_{GM}$ :	Production rate of PDGF by macrophages	$d_Q$ :	TIMP degradation rate	$M$ :	Macrophages density		
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$M$ :	Macrophages density																																								
Cilla <i>et al.</i> <sup>19</sup>	$\begin{cases} \frac{\partial C_{S_c,w}}{\partial t} = -C_{S_c,w} \left(1 + \exp \frac{-S_r C_{c,w}}{C_{c,w}^{th}}\right) \\ \frac{\partial C_{S_s,w}}{\partial t} = -C_{S_c,w} \left(1 + \exp \frac{-S_r C_{c,w}}{C_{c,w}^{th}}\right) + C_{S_s,w} \frac{C_{c,w}}{C_{c,w}^{th}} m_{S_s} \end{cases}$																																								
	<table> <tr> <td><math>C_{S_c,w}</math>:</td> <td>Contractile SMC concentration</td> <td><math>C_{c,w}^{th}</math>:</td> <td>Maximum concentration of cytokines</td> </tr> <tr> <td><math>S_r</math>:</td> <td>Contractile SMCs differentiation</td> <td><math>C_{S_s,w}</math>:</td> <td>Synthetic SMC concentration</td> </tr> <tr> <td><math>C_{c,w}</math>:</td> <td>Cytokines concentration</td> <td><math>m_{S_s}</math>:</td> <td>SMCs migration rate</td> </tr> <tr> <td><math>C_{S_s,w}</math>:</td> <td>Synthetic SMC concentration</td> <td></td> <td></td> </tr> </table>	$C_{S_c,w}$ :	Contractile SMC concentration	$C_{c,w}^{th}$ :	Maximum concentration of cytokines	$S_r$ :	Contractile SMCs differentiation	$C_{S_s,w}$ :	Synthetic SMC concentration	$C_{c,w}$ :	Cytokines concentration	$m_{S_s}$ :	SMCs migration rate	$C_{S_s,w}$ :	Synthetic SMC concentration																										
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**TABLE 10. Summary of the governing equations used in the collagen formation.**

Reference	Governing equations								
Mckay <i>et al.</i> <sup>64</sup>	$\frac{dG}{dt} = \rho_G S - d_G G$								
	<table> <tr> <td><math>G</math>:</td> <td>Collagen density</td> <td><math>d_G</math>:</td> <td>Collagen degradation</td> </tr> <tr> <td><math>\rho_G</math>:</td> <td>Collagen production from SMC's</td> <td></td> <td></td> </tr> </table>	$G$ :	Collagen density	$d_G$ :	Collagen degradation	$\rho_G$ :	Collagen production from SMC's		
$G$ :	Collagen density	$d_G$ :	Collagen degradation						
$\rho_G$ :	Collagen production from SMC's								
Cilla <i>et al.</i> <sup>19</sup>	$\frac{\partial C_{G,w}}{\partial t} = G_r C_{S_s,w} - d_G C_{G,w}$								
	<table> <tr> <td><math>C_{G,w}</math>:</td> <td>Collagen concentration</td> <td><math>C_{S_s,w}</math>:</td> <td>Synthetic SMC concentration</td> </tr> <tr> <td><math>G_r</math>:</td> <td>Collagen secretion rate</td> <td><math>d_G</math>:</td> <td>Collagen degradation rate</td> </tr> </table>	$C_{G,w}$ :	Collagen concentration	$C_{S_s,w}$ :	Synthetic SMC concentration	$G_r$ :	Collagen secretion rate	$d_G$ :	Collagen degradation rate
$C_{G,w}$ :	Collagen concentration	$C_{S_s,w}$ :	Synthetic SMC concentration						
$G_r$ :	Collagen secretion rate	$d_G$ :	Collagen degradation rate						

they do not spread due to diffusion. Model parameters, such as concentration and passing rate into the intima were depicted in the literature along with appropriate boundary conditions.<sup>38,107</sup> A similar

approach was adopted by Mckay *et al.*<sup>64</sup> and Ibragimov *et al.*<sup>45</sup> Summary of the governing equations used in SMCs proliferation is shown in Table 9.

**TABLE 11. Summary of the governing equations used in the 2D atherosclerotic plaque growth models.**

Reference	Governing equations	
Zohdi <i>et al.</i> <sup>112</sup>	$\dot{x} = K\eta$ Parameters $\dot{x}$ : Intimal thickness	$\eta$ : Particle adhesion distribution function
Bulelzai and Dubbel-dam <sup>11</sup>	$K$ : Intimal growth rate constant $V(t + \Delta t) = V(t) + \left( v_M \frac{dM}{dt} + v_{Lox} \frac{dLox}{dt} + v_m \frac{dm}{dt} + v_F \frac{dF}{dt} \right) V(t) \Delta t$ $v_m = 10^{-17} \text{ m}^3$ $V(t)$ : Plaque volume $v_M = 10^{-14} \text{ m}^3$ $v_{Lox} = 10^{-21} \text{ m}^3$ $v_F = 10^{-13} \text{ m}^3$	$M$ : Macrophage concentration $Lox$ : Ox-LDL $m$ : Monocyte concentration $F$ : Foam cells concentration
Fok <sup>33</sup>	$\dot{R} = -\frac{\alpha \theta_0(0) C_1(\lambda_1, \lambda_2)}{R \Delta_0(R)} + \frac{1}{2} \left( \frac{1-R^2}{R} \right) - \frac{\beta \sigma[R; \theta_0(0)]}{R \Delta_0(R) \lambda_1} \{ C_2(\lambda_1, \lambda_2) [RK_1(\lambda_1, R) - K_1(\lambda_1)] - C_3(\lambda_1, \lambda_2) [RI_1(\lambda_1, R) - I_1(\lambda_1)] \}$ $\alpha$ : Chemotactic parameter $\beta$ : Proliferation parameter $\theta_0(0)$ : Initial angle of injury	$\lambda_1, \lambda_2$ : Steady-state diffusion–degradation parameters $I_1(\cdot), K_1(\cdot)$ : Modified Bessel functions $C_1, C_2, C_3$ : constants
Silva <i>et al.</i> <sup>89</sup>	$\frac{dh}{dt} = \frac{k_1}{Ah} Q_{ox} \cdot Q_M$ $h$ : New intima's height $k_1 = 1 \text{ cm} \cdot (\text{g}^{-1} \text{ s}^{-1})$ $A = 1 \text{ g} \cdot \text{cm}^{-3}$	$Q_{ox} = 0.25 \text{ g} \cdot \text{cm}^{-1}$ $Q_M = 0.1$
Gabriel <i>et al.</i> <sup>35</sup>	$x^{j+1} = x^j + f_g \max \left\{ \frac{K C_w - K_0 C_c}{K_0 C_c}, 0 \right\} n$ $x$ : Material point displacement $f_g$ : Multiplicative factor $K$ : Endothelial wall's LDL permeability coefficient	$C_w$ : LDL concentration $K_0$ : Normal flow permeability $C_c$ : 1.2
Hao and Friedman <sup>42</sup>	Plaque weight = $(M + F + S + T) d\Omega$ $M$ : Macrophage density $F$ : Foam cells density	$n$ : local surface normal $S$ : SMCs density $T$ : T cells density
Yang <i>et al.</i> <sup>106</sup>	$\left. \begin{aligned} f_s^f &= \beta C_s \text{ in } \Omega_s^t \\ f_s^g &= \gamma f_s^f \end{aligned} \right\} f_s^g = \gamma f_s^f$ $f_s^g$ : Foam cells accumulation $\beta$ : coefficient $C_s$ : Foam cells concentration	$f_s^g$ : Plaque growth function $\gamma$ : constant

*Collagen Formation*

The formation of collagen, the extracellular matrix created by the SMCs, was described in the work of McKay *et al.*<sup>64</sup> using production and degradation rates. The process of collagen formation was also included in Cilla *et al.*<sup>19</sup> model simplified the biochemical process by neglecting the diffusion and the convection terms, thus leaving only the secretion and the degradation rates using values presented in the literature. Details of the governing equations used in the collagen formation are depicted in Table 10.

*Atherosclerotic Plaque Growth and Rupture*

Atherosclerotic plaque fate has been extensively studied so far. Atherosclerosis growth could be categorised based on whether they use ODEs or PDEs with the vast majority of the models incorporating PDEs whereas only a small fraction entails

ODEs.<sup>11,20,21,45,71,108,111</sup> Following, a comprehensive analysis of plaque growth models and their simplifications, modelling is presented categorised as 2D and 3D.

Two-dimensional models, tabulated in Table 11, are the majority of the published work so far addressing progress and growth of the atherosclerotic plaque. What is common among all existing studies is the great number of simplifications applied to these models. Nevertheless, some striking features are noticed concerning the methodology followed by the authors. As such, one of the first studies correlated arterial plaque growth with a growth rate constant derived from empirical data, material properties, and the monocytes accumulation in the arterial wall.<sup>112</sup> The study also proposed that the fibrous cap rupture could be described in terms of stored energy occurring at a critical time that depends on the value of the hydrostatic pressure; when the pressure exceeds a threshold, rupture occurs. Another approach was presented by Li

*et al.*<sup>58</sup> suggesting that Arbitrary Lagrangian–Eulerian (ALE) and Ogden strain energy methodologies could describe the fluid flow and plaque structure interplay. Some of the simplifications of this work are the use of concentric plaque geometry, the lack of morphological accurate factors such as the lipid core due to macrophages, and finally the vessel geometry. Fazli *et al.*<sup>29</sup> indicated that the growth rate of the plaque is not linear with time and the rate is high in the beginning, then it becomes smaller and finally it increases again but not as much as the growth rate in the beginning. A few years later, a modified version of the model by Zohdi *et al.*<sup>112</sup> including macrophages, ox-LDL, monocytes and foam cells was published by Bulelzai and Dubbeldam.<sup>11</sup> disregarding the role of SMCs and collagen in the plaque formation and growth. A completely different approach was presented by Fok<sup>33</sup>; a single ordinary differential equation free of boundary conditions to describe the evolution of arterial stenosis driven by the SMCs flux from the media, their proliferation, and subsequent death. Other recent studies proposed a 1D model of lesion growth assuming ECM, smooth cells and other biological factors do not participate in the inflammatory process and a temporal scale-independent model without mass conservation in the lesion and only LDL mass transport considered.<sup>35,89</sup> One of the more comprehensive models was proposed by Hao and Friedman<sup>42</sup> where the plaque weight estimation includes the macrophages, the T-cells, the foam cells, the SMCs, and the ECM density. Finally, one of the latest works employed the ALE method to solve the equations in both the fluid and the solid domain one of the key features of the results was the observation of a two-humps plaque shape instead of a bell-shaped one.<sup>106</sup> Despite the capability to simulate the plaque growth, several biochemical factors

were disregarded, and the vessel wall density was assumed to be a constant value, independent of time.

On the other hand, 3D models are scarce. The governing equations used in the 3D atherosclerotic plaque growth models are tabulated in Table 12. One of the first attempts proposed a 3D model with a plaque growth function calculating the increase of the wall thickness.<sup>61</sup> The linear function implemented two constants representing the relation between coronary artery diameter change and wall shear stress in a 3-year period, and the time-averaged wall shear stress. In general, this model has limited applicability since it could only serve for simulating the plaque initiation. Filipovic *et al.*<sup>32</sup> correlated intimal thickening to the shear stress via a system of PDEs simulating the inflammatory process. In order to follow the change of the vessel wall geometry during plaque growth, a 3D mesh moving algorithm was applied. They also simplified the inflammatory process disregarding smooth muscle cell proliferation and foam cells formation including only ox-LDL, macrophages, and cytokines. Another approach correlates growth of the plaque to the accumulation of foam cells, SMCs, and collagen.<sup>19</sup> The velocity of the growth was related to the variation of SMCs, the volume of the spherical foam cells and the ellipsoidal SMCs. Finally, one of the latest multi-scale models utilises the occupied volume due to the foam cells stratification, the volume of the accumulated foam cells, and the portion of endothelium in the fatty streak formation.<sup>99,100</sup> A threshold of 1% was set as the maximum arterial wall deformation without significant impact on the blood flow dynamics.

The validation of the aforementioned models is also important and the relevant information in the corresponding studies is shown in Table 13.

**TABLE 12. Summary of the governing equations used in the 3D atherosclerotic plaque growth models.**

Reference	Governing equations			
Liu and Tang <sup>61</sup>	$WTI = K_1 - K_2 \tau$			
	WTI:	Wall thickness increase	$K_2$ :	Constant
	$K_1$ :	constant	$\tau$ :	Time-averaged WSS
Filipovic <i>et al.</i> <sup>32</sup>	$\partial_t M + \text{div}(v_w M) = c_2 \Delta M - k_1 O \cdot M + S/(1 + S)$			
	$M$ :	Macrophages concentration	$k_1$ :	Solute lag coefficient
	$u_w$ :	Inflammatory velocity	$O$ :	Ox-LDL
	$c_2$ :	Diffusion coefficient	$S$ :	Cytokines concentration
Cilla <i>et al.</i> <sup>19</sup>	$\nabla \cdot u = \frac{\partial C_{F,w}}{\partial t} \text{Vol}_{\text{foamcell}} + \frac{\partial \Delta C_{S,w}}{\partial t} \text{Vol}_{\text{SMC}} + \frac{\partial C_{G,w}}{\partial t} \frac{1}{\rho_G}$			
	$u$ :	Material points velocity	$\text{Vol}_{\text{SMC}}$ :	SMC volume
	$C_{F,w}$ :	Foam cells concentration	$C_{G,w}$ :	Collagen concentration
	$\text{Vol}_{\text{foamcell}}$ :	Foam cell volume	$\rho_G$ :	Collagen density
	$\Delta C_{S,w}$ :	SMCs variation		
Tomaso <i>et al.</i> <sup>99,100</sup>	$\Delta h = \frac{V_E - V}{A_{\text{tot}}}$			
	$\Delta h$ :	Intima-media thickness growth	$V$ :	Accumulated foam volume
	$VF$ :	Wound model foam cells stratification	$A_{\text{tot}}$ :	Portion of endothelium



**TABLE 13. Summary of validation information of atherosclerosis initiation and progression models.**

Reference	Validation
Bulelzai and Dubbel-dam <sup>11</sup>	Results were in contrast with results presented by Zohdi <i>et al.</i> <sup>112</sup>
Calvez and Ebde <sup>12</sup>	Results were in contrast with results presented by Zohdi <i>et al.</i> <sup>112</sup> This divergence was attributed to the differences in the uptake mechanisms of LDL particles.
Silva <i>et al.</i> <sup>89</sup>	No validation
Gessaghi <i>et al.</i> <sup>36</sup>	The model reproduces qualitatively few aspects of early stage lesions such as wall thickness increase and identify prone areas when compared with experimental data of Guyton and Klemp <sup>39</sup> and Homma <i>et al.</i> <sup>44</sup>
Reddy and Seshaiyer <sup>78</sup>	No validation
Cilla <i>et al.</i> <sup>19</sup>	LDL concentration at the low WSS areas of the arterial wall was reported to be in good agreement with published experimental results by Meyer <i>et al.</i> and qualitatively predicts evolution of stenosis when compared with results by Achenbach <sup>1</sup>
Hao and Friedman <sup>42</sup>	No validation
Friedman and Hao <sup>34</sup>	Simulation results were in qualitative agreement with Rayner <i>et al.</i> <sup>77</sup> for plaque regression using anti-miR33 treatment, with experimental results of Schioppa <i>et al.</i> <sup>82</sup> on plaque weight, with Panousis <i>et al.</i> <sup>72</sup> regarding ABCA1 increase when using TGF- $\beta$ treatment and with Lovren <i>et al.</i> <sup>62</sup> for plaque growth decrease when miR-145 was used to target SMCs.
Mckay <i>et al.</i> <sup>64</sup>	No validation
Filipovic <i>et al.</i> <sup>31</sup>	Besides the lesion shape LDL distribution in low WSS area was found in good agreement with plaque composition experimental results by Cheng <i>et al.</i> <sup>16</sup>
El Khatib <i>et al.</i> <sup>52,53</sup>	No validation
Ougrinovskaia <i>et al.</i> <sup>71</sup>	Qualitative comparison of simulation results with studies of Ibragimov <i>et al.</i> , <sup>45</sup> Libby and Ridker, <sup>59</sup> Libby <i>et al.</i> <sup>60</sup>
Filipovic <i>et al.</i> <sup>32</sup>	Qualitative comparison with plaque geometry obtained from image reconstruction.
Chalmers <i>et al.</i> <sup>13</sup>	Model predictions agree qualitatively with experimental studies in mice and rabbits presented by Feig <i>et al.</i> <sup>30</sup> and the work of Rohatgi <i>et al.</i> <sup>80</sup>
Yang <i>et al.</i> <sup>106</sup>	No validation
Zohdi <i>et al.</i> <sup>112</sup>	Authors state good qualitative agreement of the simulations with observations
Fok <sup>33</sup>	Comparison with experimental data from Stadius <i>et al.</i> <sup>92</sup>
Liu and Tang <sup>61</sup>	Plaque growth estimated rate is consistent with results presented by Stone <i>et al.</i> <sup>95</sup>
Tomaso <i>et al.</i> <sup>99,100</sup>	Model predictions were in good agreement with in vivo observations from multislice computed tomography (MSCT)

## PERSPECTIVES AND CHALLENGES

All the aforementioned mathematical models incorporate simplifications regarding the biochemical processes involved in the lesion formation and the atheromatous plaque progress. Nevertheless, the computational procedure is based on several parameters regarding cell dynamics, such as diffusion and concentration. Despite the fact that additional experiments are needed so as to fine tune several of these parameters, it should be also noted that these parameters cover only a fraction of the biochemical processes involved in the development of the lesion. The interplay of other factors such as triglycerides, HDL, B cells, sterol regulatory elements, signaling proteins has not yet been sufficiently described by mathematical equations or computational models. Even though a significant amount of work is published so far regarding the build-up of the plaque, this could only be considered as the tip of the iceberg. Consequences of the progression of the atheromatous plaque such as plaque rupture due to its vulnerability to the subjected stresses and subsequent thrombus formation are still

unexplored since only few studies are published presenting concise results. In view of this, the purpose of the scientific community to suggest a reliable tool to predict areas of the vasculature prone to developing atheromatous plaque and, at the same time, predict the risk of huge plaque rupture posing life-threatening consequences to the patient, remains largely unfulfilled.

Despite the huge efforts that have been made so far, a lot of uncertainties exist and should be convincingly clarified before pursuing a more complete multiscale computational platform. Next, we attempt to briefly point out some of these uncertainties in the present state of the art.

First, the nature of the blood and the subsequent modelling method is very important. Part of the published studies model blood as a Newtonian fluid, whereas others prefer non-Newtonian approach. Recent studies comparing available blood rheological models demonstrated some of the misconceptions when performing cardiovascular simulations. Skiadopoulos *et al.*<sup>91</sup> concluded that WSS distribution pattern is unconstrained by the rheological model

contrarily to its magnitude and oscillations, which is in accordance with Ai and Vafai.<sup>2</sup> In their work, it was found that Newtonian model performs satisfactorily in high shear and flow rates, but the formation of atheromatous lesions is overestimated in areas where WSS exhibits an oscillating nature. Another aspect related to the blood flow nature is the development of the recirculation zone and the impact on WSS distribution in cases of large stenosis. It was shown by Nematollahi *et al.*<sup>67</sup> that the recirculation zone in arteries with severe stenosis, and the decrease of WSS in the reattachment points, which favors disease progress, is inadequately modeled with a Newtonian approximation. Similar findings were presented by Millon *et al.*,<sup>65</sup> stressing the existence of atherosclerotic lesions in the segment after the stenosis and not before, which was correlated with the low WSS distribution in the post-stenosis area. It has been also stressed that the recirculation zones generated by the plaque development and the ongoing change of the blood flow profile are related to phenomena that are indicative of possible plaque rupture. Such phenomena are delamination and erosion, yet there is no solid evidence for their dependency on WSS distribution.<sup>7</sup> Nevertheless, Non-Newtonian constitutive equations for blood tend to Newtonian behavior at high shear rates and therefore their use makes sense for shear rates typically lower than  $50 \text{ s}^{-1}$ , at which the residence time of red blood cells—a key aspect of Non-Newtonian behavior—should be taken into account.<sup>5</sup>

Secondly, the introduction of more realistic geometries would greatly favor blood flow assessment, the interconnected onset of the inflammatory process, and the disease progress. Up-to-date techniques enable the reconstruction of patient-specific geometries facilitating the observation of the cardiovascular disease in several conditions: disease-free and through several stages of the inflammatory process and subsequent plaque growth. The continuous progress in computed tomography coronary angiography is sought to elucidate the onset and progress of the disease with respect to interpatient and inpatient variability. Differentiations of carotid, femoral, and coronary arteries amongst different patients will enhance prognosis of the prone regions due to different shear stress distribution, as well as the in-time evaluation of the plaque rupture risk. In addition, anatomical variations of the same type of artery in a group of patients would lead to more sophisticated model predictions since each vasculature region would respond differently in the blood flow dynamics.<sup>14,55</sup> This approach necessitates more accurate and patient-oriented boundary conditions of the blood flow and the mass transport since each patient profile varies because of the age, the life-style, or other underlying diseases.<sup>24,81</sup>

Thirdly, biological tissue's transport properties pose an additional challenge. To date, the multi-layer approach is the most common methodology to describe the arterial wall. The set of equations and the corresponding boundary conditions provide a realistic description of the biological tissue anatomy. Nonetheless, development of more sophisticated predictive tools is dependent to more accurate parameters involved in the biological transport phenomena, such as the permeability, the porosity, and the diffusivity. Likewise, other important factors are the upscale of animal experimental results to humans, the lack of human-tissue properties and the lack of information regarding the transition phase between normal and stenosed arteries.<sup>50</sup> Further advances in multiscale modelling tools depend on data regarding cell-population dynamics, lipid-core formation, and fibrous cap as well as plaque rupture.<sup>106</sup> In this context, a suggested option is to modify the four-layer model to account for the glycocalyx effect or the artery wall layers thickness variability thus yielding a more sophisticated model for the plaque morphology in the circumferential and vertical direction.<sup>49,106</sup>

Finally, a significant goal is the establishment of an equilibrium state via modifying either the macrophage or the HDL influx or reduce LDL levels by using statins. Early findings suggest that plaque regression could be facilitated,<sup>8,9</sup> and an equilibrium could be achieved if the macrophage influx is modified at its early stage. Identification of such a time window is crucial since macrophage influx reduction in a later stage of the atheromatous progression would only result in a slower growth rate.<sup>21,22,57,66</sup> Another aspect of the atherosclerosis disease study with increasing interest is the plaque growth regression due to HDL particles mimicking high lipid proteins.<sup>4,86,97,110</sup> Purpose of these studies was to examine the ability to achieve plaque equilibrium at its early stage when its size is relatively small. On the other hand, results have shown that efforts to engineer the fate of a larger plaque are less effective. Modelling studies incorporating HDL effect are scarce to date.<sup>21,34</sup> Recently, Friedman and Hao<sup>34</sup> predicted plaque weight and macrophage density decline because of increase in HDL efficiency, however, no equilibrium was reached. Authors noted that the plaque regression observed in clinical studies with animals is not observed in human clinical studies with a late-stage plaque of complicated structure. Future work should address the efficacy of HDL increase towards achieving plaque equilibrium in patients with early-stage plaque, adding more clinical evidence regarding patients with late-stage atheromatous plaque and already suffering from subsequent symptoms.

## CONCLUSIONS

Despite the great effort been made so far, it is not yet possible to comprehensively predict or re-engineer the fate of atherosclerosis. Close cooperation by experts from different sectors such as medicine, engineering, physics, and chemistry in this multidisciplinary problem would seek more experimental research generating customised data for necessary parameters involved in particles transport inside the arterial wall. Consequently, modeling accuracy could be upgraded regarding arterial properties, blood flow dynamics, biochemical processes, and boundary conditions. This would be a crucial step towards *in silico* biomedical trials that are expected to have a deep impact to the patient quality of life, the medical procedures and the economics of cardiovascular diseases.

## REFERENCES

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