

Universidade de Coimbra

# From cells to vessels: a versatile phase-field approach

Maurício Moreira-Soares — CFisUC, University of Coimbra

Supervisor: Prof. Rui D. M. Travasso





## :~\$ Introduction > biological motivation



- ~ Cell migration is <u>key</u> for life
- ~ The study of cell migration allows to better understand diseases

Scott et al, PLoS One 2010

~ Metastasis is one of the most complex migration phenomena



K Wolf et al, JCB 2013

## :~\$ What does physics have to do with cell biology?

#### Macrophages





Sirka O. K. et al, JCB 2018



Chih-Wei Hsu et al, PLoS One 2015

## :~\$ Introduction > phase-field models



Free energy functional

$$F[\phi] = \int_{\Omega} d\mathbf{r} \left[ V(\phi) + \frac{\varepsilon^2}{2} |\nabla \phi|^2 \right]$$

Dynamics equation

$$\partial_t \phi = \nabla^2 \left( \frac{\delta F\left[\phi\right]}{\delta \phi} \right) = \nabla^2 \left( \phi^3 - \phi - \varepsilon \, \nabla^2 \phi \right)$$

Cahn-Hilliard dynamics



## :~\$ Introduction > phase-field models



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#### Cahn-Hilliard dynamics



## :~\$ Phase-field models > biological systems

#### Angiogenesis

#### Cell Modelling

M Nonomura, PLoS One 2012



M Moreira-Soares et al, Sci Rep 2018







D Kulawiak et al, PLoS Comp Biol 2016

#### Tumour Growth



#### Axonal Growth



B Costa-Gomes, Master's Thesis, 2016

H Frieboes et al, J Teor Biol 2010

# Part I - Cell Migration

#### :~\$ Part I > cell migration



- ~ The cell is described by the parameter  $\phi$
- ~ and the fibres by  $\Psi$
- ~ they interact by <u>adhesion</u> and <u>repulsion</u>



# How is migration affected by mechanical constraints?

## :~\$ Part I > Results > migration dynamics



# :~\$ Did you bring the 3D glasses?



:~\$ Part I > Results > mean velocity vs density



~ Mean velocity as a function of the density of fibres

## :~\$ Part I > Results > migration dynamics

#### ~ The diffusion exponent calculated helps us to characterise migration







:~\$ Part I > Results > diffusion exponent vs density



~ Diffusion exponent as a function of density of fibres

# Part II - Angiogenesis

## :~\$ Part II > Angiogenesis

#### ~ Growth of new blood vessels from a preexisting vasculature



R K Jain, Nat Med, 2007

## :~\$ Part II > Angiogenesis



- ~ Tip Cells (ETCs)
- ~ Stalk Cells (ESCs)
- ~ Hypoxic Cells ~ Produce Vascular Endothelial Growth Factors
- ~ Blood flow
  - ~ irrigates the tissue





(b)



#### L B Wood, IJRR, 2011

## :~\$ Phase-field model for Angiogenesis

- ~ We model the vessels  $\phi$  and the hypoxic cells  $\psi$
- ~ The tissues cannot superpose
- ~ Endothelial Tip Cells are guided by chemotaxis

## :~\$ Phase-field model for Angiogenesis



#### ~ Two rules for deactivating VEGF production were tested

## :~\$ Phase-field model for Angiogenesis



 $t=2~\mathrm{h}$ 

 $t=8~\mathrm{h}$ 

 $t = 25 \mathrm{h}$ 

~ while the vessel network grows, the growth factor is consumed

# :~\$ Ready for more movies?



What is the role of VEGF gradients in driving anastomoses?

SCIENTIFIC REPORTS OPEN Angiogenic Factors produced by Hypoxic Cells are a leading driver of Anastomoses in Sprouting Angiogenesis-a computational Mauricio Moreira-Soares 1, Rita Coimbra², Luís Rebelo³, João Carvalho¹ & Rui D. M. Travasso¹ Received: 16 May 2017 study Accepted: 29 May 2018 Published online: 07 June 2018

:~\$ Part II > Results > angiogenesis in 2D



~ There are major differences when blood flow is considered

:~\$ Part II > Results > angiogenesis in 2D



Rule 2

Rule 1

~ Hypoxia driven VEGF production is able to tailor the vessel network to fulfil the needs of the tissue

~ the tissue is a major regulator of the blood vessel network morphology

### :~\$ Part II > Results > angiogenesis in 2D



~ The networks are resilient to changes in the cell metabolism.

## :~\$ Part II > Results > angiogenesis in 3D



~ The differences between the networks are even more pronounced in 3D

## :~\$ Part II > Results > angiogenesis in 3D



~ Blood flow regulation is an essential ingredient for anastomoses in 3D!

~ The morphology of the vessel networks is resilient to changes in cell metabolism, such as proliferation rate and chemotactic response;

~ The distribution of tissue cells and the concentration of the growth factors they produce are the major factors in determining the final morphology of the network.

## :~\$ Conclusions && future work

- # overview:
- ~ phase-field approach is easy to implement and versatile
- ~ it allows the development of minimalistic models to build hypothesis
- ~ the number of parameters is reduced when compared with other models
  - # perspectives:
- ~ model angiogenesis with cells producing VEGF while migrating
- ~ study of angiogenesis in Non-Alcoholic Fat Liver Disease (NAFLD)

Try PF modelling with my Python implementation (for teaching purposes): https://gitlab.com/phydev/PhyBio U C

#### Thank you and come visit us in Coimbra!

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http://cfisuc.fis.uc.pt

mms@uc.pt

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