MULTISCALE MODELING OF VASCULAR ADAPTATION

LA VIE EST UN LONG FLEUVE TRANQUILLE

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PLAN

- Medical and Biology Background
- Dynamical System Approach
- Multiscale Computational Framework
- Toward control

Conflict of Interest: co-founder of ORintel specialized in smart operating room.



OVERVIEW

Vascular disease (ex. arterial occlusion)



Surgical intervention → Vein graft bypass (femoral artery in the side picture just as example)



Intima HYPERPLASIA

migration of SMC in intima \rightarrow proliferation \rightarrow ECM deposition \rightarrow Lumen narrowing

+

Wall REMODELING

cellular reorganization in media → preservation or loss of lumen

Vascular adaptation

→ due to change in flow regime (from continuous low pressure to pulsatile high pressure), vein graft faces 2 main adaptation process



Interplay between Hyperlasia and Remodeling may leads to total lumen narrowing after implant or transcient outward growth.

PATTERN FORMATION (ACTUAL IMAGE VS COMPUTER GENERATED IMAGE)



HISTOMORPHOLOGY OF A VEIN GRAFT AT IMPLANTATION (A) AND AT SIX MONTHS POST-IMPLANTATION (B)



Events in Vascular Remodeling



BIOLOGIC PROCESSES IN VEIN GRAFT ADAPTATION

	Day 1		Day 2 to 7		Week 2 to 4		Month 2 to 3		Long-term	
	Reduced Shear	Elevated Shear								
Intimal Thickness	0	0	0	0	2	1	4	2	5	3
Medial Thickness	0	0	0	0	2	2	4	4	5	5
Outside Radius	0	0	0	0	1	2	3	4	4	5
Smooth Muscle Cell Proliferation	-4	-4	5	3	3	2	1	1	1	1
Matrix Content - Collagen	0	0	0	0	3	2	5	3	2	1
Matrix Content - Proteoglycan	0	0	-A.	3	2	1	1	0	0	0
Macrophage Content	0	0	5	3	3	2	1	0	0	0



DYNAMICAL SYSTEM

Assuming a linear dependence for each parameter on the driving mechanical quantities σ and τ , we can study the <u>intimal area variation</u>:



$$A_{ECM}^{I} = -a_2 D t A_{SMC}^{I}$$
 if $A_{ECM} > 0$, 0 otherwise (2)
Intimal area variation due to
ECM deposition by SMC in

intima

Unknowns and Parameters

Lumen

Internal Elastic

Lamina (IEL)

Intima

Media

- $A_{SMC}^{I} + A_{ECM}^{I}$ = area of the intima
- $A_{SMC}^{M} + A_{ECM}^{M}$ = area of the media
- R_{IEL} = Internal Elastic Lamina radius
- α_i = coefficients of intimal dynamic

DYNAMICAL SYSTEM

Transmigration of monocytes and conversion to macrophages = critical force in vein graft adaptation. This time dependent component is modeled using an activity factor A(t), such as...

with $T_i = \alpha_8 > 0$, when macrophages' density reach maximum $A(t) = \exp - \mathop{\mathbb{C}}_{\dot{e}}^{\mathcal{R}} \frac{t - T_i \overset{0}{0}^2}{dT_i \overset{0}{\otimes}} \quad (3) \qquad \text{value} \\ \text{and } \delta T_i = \alpha_9 > 0 \text{, time scale of decay of macrophage's}$

density

Just for insertion of (3) in dynamical system referred to the intima. equations (1) and (2), the following are reached:

$$\begin{aligned} \stackrel{I}{A_{SMC}} &= A(t) \bigg[-\partial_1 \mathsf{D} t^- A_{SMC}^I - \partial_5 \mathsf{D} t^- 2\rho R_{IEL} \frac{A_{SMC}^M}{A_{SMC}^M + A_{ECM}^M} \bigg] \quad (4) \\ \stackrel{I}{A_{ECM}} &= A(t) \bigg[-\partial_2 \mathsf{D} t^- A_{SMC}^I \bigg] \quad \text{if } \mathsf{A}_{ECM} > 0 \text{ , 0 otherwise} \quad (5) \end{aligned}$$

Dynamical system has now to be coupled with expression density of probability of specific genes related to cellular activities of strongly interesting for the vein graft remodeling.

INFLUENCE OF SHEAR ON THE GRAFT GEOMETRY, WITH INCLUSION OF AN ACTIVE LUMEN AREA -SHEAR FEEDBACK LOOP AND EXCLUDING THE EFFECT OF WALL TENSION. COMPARTMENT/ LAYER THICKNESS (A) AND GRAFT RADIUS (B).



INFLUENCE OF SHEAR ON GRAFT GEOMETRY, WITH S K LOOP FΔ ΗΕΔ F EEDBAC AN Ε R Δ(F ELL Δ F G COMPARTM R **(A)** ND GRAFT Е KNESS AT Ε Δ H RADIUS (B).



INFLUENCE OF NONLINEAR COUPLING BETWEEN OUTWARD REMODELING AND WALL THICKENING ON GRAFT GEOMETRY.



SIMULATION RESULT OBTAINED WITH A 20 PER **CENT REDUCTION IN FLUX, WHILE THE OBJECTIVE** FOR SHEAR STRESS AND T ENSI Ε SE1 -1 E Ο R THICKNESS INITIAL STAGE. COMPARTMENT/ LAYER (A) AND GRAFT RADIUS (B).



PARAMETER SPACE EXPLORATION OF THE DYNAMICAL SYSTEM USING A MONTECARLO SIMULATION

EXTERNAL RADIUS VERSUS LUMEN RADIUS . RED SYMBOLS DEMONSTRATE THOSE SIMULATIONS WHERE A GREATER THAN 5-FOLD INCREASE IN THE EXTERNAL RADIUS WAS PREDICTED.





SPATIAL DISTRIBUTION OF CELL PROLIFERATION AND APOPTOSIS IN RABBIT VEIN GRAFTS HARVEST AT 4, 7, AND 14 FOLLOWING EXPSOURE REDUCED OR ELEVATED SURFACE SHEARING FORCES



ONE DIMENSIONAL AGENT BASE MODEL









SMC/ECM under apoptosis or mitosis

SMC/ECM

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0

EEL

IEL

LUMEN

- 1. Hexagonal sites shifting path before cell/matrix mitosis.
- 2. Hexagonal sites after cell/matrix mitosis.



- 3. Hexagonal sites shifting path before cell/matrix apoptosis.
- 4. Hexagonal sites after cell/matrix apoptosis.

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Axiomatic rules	Comments			
*	SMC/ECM			
^{1. p} division ^{=p} apoptosis ^{, βp} degradation ^{=p} production ⁻	apoptosis/mitosis.			
2. $p_{division} = \alpha_1 > 0, p_{production} = \alpha_2 > 0.$	Basic solution.			
3. $A(t) = \exp(-(\frac{t-T_i}{\delta T_i})^2)$.	Macrophage activity.			
4. $T_i = \alpha_3 > 0, \delta T_i = \alpha_4 > 0.$	Macrophage growth and decay time.			
5. $p_{through} = \alpha_5 A(t)(1 + \alpha_{13}\Delta \tau(y)/\tau)(1 + \alpha_{14}\Delta \sigma_r(y)/\sigma), \alpha_5 > 0.$	The probability that an SMC crosses the IEL.			
6. $P_{division} = \alpha_1 A(t)(1 + \alpha_6 \Delta \tau(y)/\tau)$	The probability that an SMC divides inside intima.			
7. $\Delta \tau(y) = \Delta \tau_{wall} \exp(-\frac{y - R_{lumen}}{\alpha_8 d_{SMC}})$	Shear stress calculation (6).			
8. $p_{apoptosis} = \alpha_1 A(t),$	The probability that an SMC dies inside intima.			
9. <i>Pdivision</i> = $\alpha_1 A(t)(1 + \alpha_9 \Delta \sigma_r / \overline{\sigma})$	The probability of mitosis of SMC inside media.			
$10. p_{apoptosis} = \alpha_1 A(t),$	The probability of apoptosis of SMC inside media.			
$11. p_{production} = \alpha_2 A(t),$	ECM degeneration			



INTERESTING PATTERN INFORMATION DURING INTIMAL AND MEDIAL GROWTH.



Intimal Hyperplasia

Outward Remodeling

SMC INSIDE INTIMA VS TIME AT 75% PERTURBATION RATE



SOME INTERESTING TEMPORAL OSCILLATIONS





COUPLING A DYNAMIC SYSTEM DESCRIBING THE VEIN GRAFT POST SURGICAL REMODELING WITH DENSITY PROBABILITY OF SPECIFIC GENES' EXPRESSION



Events in Vascular Remodeling



GENE CLUSTERING

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How to cluster gene expression dynamics in response to environmental signals

Yaqun Wang, Meng Xu, Zhong Wang, Ming Tao, Junjia Zhu, Li Wang, Runze Li, Scott A. Berceli and Rongling Wu Submitted: 25th February 2011; Received (in revised form): 16th May 2011



- Can we identify a gene (or a small set of genes) that control intimal growth?
- Can we define a density of probability related to their rate of expression?
- Can we coupled the dynamical system described previously with the genetic aspect?

ELABORATION OF THE ORIGINAL DATA

N=9271; M=29; T=7 (0.08,1,3,7,14,28 days)

Gene name	Gene expression values (τ _{low})	Gene expression values (τ _{high})	Cluster	Cellular activity	
g ₁	$G^{1l}_{t1}, G^{1l}_{t2},, G^{1l}_{tT}$	G^{1h}_{t1} , G^{1h}_{t2} , , G^{1h}_{tT}	1	ΡΜΕΑ	
g ₂	$G^{2l}_{t1}, G^{2l}_{t2},, G^{2l}_{tT}$	G^{2h}_{t1} , G^{2h}_{t2} , , G^{2h}_{tT}	1	ΡΜΕΑ	
g _n	G^{nl}_{t1} , G^{nl}_{t2} , , G^{nl}_{tT}	G^{nh}_{t1} , G^{nh}_{t2} , , G^{nh}_{tT}	m	ΡΜΕΑ	
g _N	$G_{t1}^{NI}, G_{t2}^{NI},, G_{tT}^{NI}$	G^{Nh}_{t1} , G^{Nh}_{t2} , , G^{Nh}_{tT}	Μ	ΡΜΕΑ	
 N= total number of genes g_n= generic n- th gene 	 T= total number of time steps G^{nl}tt= gene expression value for the n-th gene at time t in low flow conditions 	 T= total number of time steps G^{nh}_{tt}= gene expression value for the n-th gene at time t in high flow conditions 	M= total number of clusters (each gene belongs to one of the M clusters)	In red the cellular activities influenced by specific gene	

GENE CLUSTERING

Remarks:

- Variations in environment \rightarrow Variation in gene expression (experimental set up in 2 different environments: low shear stress τ_{low} and high shear stress τ_{high})
- Time evolution \rightarrow Variation in gene expression



 Which genes? 5 clusters → A, D, F, G, H are the main drivers for our analysis

Hypothesis: 1 cluster = 1 "gene" Gene of interest Mitosis influence the vein graft remodeling trough Mobility

remodeling trough *acting on the following cellular events* Metabolism (ECM production)

CURVE FITTING OF GENE EXPRESSION: FIRST MODEL USED

BASE MODEL: We choose as base model an exponential trend for each single cluster:

- A₁ drives the amplitude
- A₂ drives the asymptote

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$$\frac{a}{dt}x_i = A_1(x_i - A_2)$$

Fitting parameters $A=[A_1,A_2,...,A_{30}]$

GENETIC ALGORITHM: In order to get the fitting parameters $(A_1,...,A_{30})$ for each system, we need to minimize the RMS deviation through a genetic algorithm implemented in Matlab

CLUSTER INTERACTION and SYSTEM SOLVER: each cluster is influenced by all the others. The model turns in a ODE system like the following (see next slide for the complete system). System solved by ode45 function with initial conditions $x_i(0)=x_i^0$

$$\begin{bmatrix}
\frac{d}{dt}X_{12} = A_1(X_{12} - A_2) + \dots + A_9(X_{21} - A_{10}) \\
\frac{d}{dt}X_{14} = \dots \\
\dots \\
\frac{d}{dt}X_{21} = A_{26}(X_{12} - A_2) + \dots + A_{30}(X_{21} - A_{10})$$

RMS DEVIATION: For each cellular event in specific environment conditions, we have a reference trend and a parameterized one. We evaluated the RMS deviation between them. The result is basically the following

$$\mathsf{RMS}_{\mathsf{xref/xfit}} = \mathsf{f}(\mathsf{A}_1, \mathsf{A}_2, \dots, \mathsf{A}_{30})$$

CURVE FITTING: KEEPING THE "ESSENTIAL"

System can be simplified (number of unknown parameters reduced) taking in account that interaction between a generic cluster i and an other j may be neglected.

$$\frac{d}{dt}X_{12} = A_{1}(X_{12} - A_{2}) + A_{3}(X_{14} - A_{4}) + A_{5}(X_{15} - A_{6}) + A_{7}(X_{16} - A_{8}) + A_{9}(X_{21} - A_{10})$$

$$\frac{d}{dt}X_{14} = A_{11}(X_{12} - A_{2}) + A_{12}(X_{14} - A_{4}) + A_{13}(X_{15} - A_{6}) + A_{14}(X_{16} - A_{8}) + A_{15}(X_{21} - A_{10})$$

$$\frac{d}{dt}X_{15} = A_{16}(X_{12} - A_{2}) + A_{17}(X_{14} - A_{4}) + A_{18}(X_{15} - A_{6}) + A_{19}(X_{16} - A_{8}) + A_{20}(X_{21} - A_{10})$$

$$\frac{d}{dt}X_{16} = A_{21}(X_{12} - A_{2}) + A_{22}(X_{14} - A_{4}) + A_{23}(X_{15} - A_{6}) + A_{24}(X_{16} - A_{8}) + A_{25}(X_{21} - A_{10})$$

$$\frac{d}{dt}X_{21} = A_{26}(X_{12} - A_{2}) + A_{27}(X_{14} - A_{4}) + A_{28}(X_{15} - A_{6}) + A_{29}(X_{16} - A_{8}) + A_{30}(X_{21} - A_{10})$$

$$fitting parameters estimation$$

$$A = [A_{1}, A_{2}, \dots, A_{30}]$$
Parameters reduction = system simplification
$$A = [A_{1}, A_{2}, \dots, A_{30}]$$
Parameters reduction = system simplification
$$Value$$

$$Cutoff below the threshold of 0.1 on resulting vector$$

NETWORK REPRESENTATION : MITOSIS LOW FLOW



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NB: solid cluster border indicates an aut influence of the cluster itself!

5 – OSCILLATIONS ANALYSIS : APOPTOSIS LOW FLOW

Hypothesis: time step discretization = 0.01days



DENSITY OF PROBABILITY (1)



The density of probability is again function of time and shear stress. We use linear interpolation in order to solve the shear stress dependence knowing the analytical trend for the generic $P_i^j(t)$ in low and high shear stress case (as done for the gene expression level).

$$P_i^j(t,\tau) \longrightarrow P_i^j(t,\tau)$$

linear interpolation

Starting with the simplest case of *matrix metabolism* (due to gene D activity):



DENSITY OF PROBABILITY (2)

Density of probability of *cellular proliferation* (due to genes D and F activity):



DENSITY OF PROBABILITY (3)

Density of probability of *apoptosis* (due to genes D and F activity):



DENSITY OF PROBABILITY (4)

Density of probability of *mobility* (due to genes A, F and D activity):



SYSTEMS COUPLING

We can now close the loop, feeding the dynamical system referring to the intimal section variation, equation (4), (5), with the densities of probability defined.



SYNTHESIS

HYPOTHESIS: A SPECIFIC, FINITE SET OF SHEAR-REGULATED GENES ARE CRITICAL TO CONTROLLING PATHOLOGIC VEIN GRAFT ADAPTATION. USING THE INTEGRATION OF MULTISCALE MODELING AND EXPERIMENTAL TECHNIQUES, THESE GENES CAN BE IDENTIFIED AND MANIPULATED *IN VIVO* TO IMPROVE VEIN GRAFT DURABILITY.

SPECIFIC AIM 1: IDENTIFY THOSE MODEL PARAMETERS, AND CORRESPONDINGLY THOSE *CORE* BIOLOGIC PROCESSES, THAT ARE MOST CRITICAL FOR ACCELERATED LOSS OF THE VEIN GRAFT LUMEN.

SPECIFIC AIM 2 CREATE AND EXPLORE A DYNAMIC GENE REGULATORY NETWORK, WHICH WHEN INTEGRATED WITH AN AGENT-BASED MODEL OF VASCULAR ADAPTATION, IDENTIFIES THE SUBSET OF GENES THAT HAVE THE MOST SIGNIFICANT IMPACT ON REDUCING INTIMAL HYPERPLASIA AND PRESERVING VEIN GRAFT LUMEN.

SPECIFIC AIM 3: VALIDATE THE MODEL PREDICTION AND EXPLORE COMBINATIONS OF KEY HUB GENES THAT PROVIDE THE MOST CRITICAL IMPACT ON THE BIOLOGIC PROCESSES THAT ARE CENTRAL TO PATHOLOGIC VEIN GRAFT ADAPTATION.

SPECIFIC AIM 4: IDENTIFY THE OPTIMUM COMBINATION OF GENES THAT WILL MOVE FORWARD INTO A LARGE ANIMAL VALIDATION MODEL AND TRANSLATED INTO A THERAPEUTIC TOOL TO IMPROVE VEIN GRAFT SURVIVAL.



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