Modelling the Dementia Brain Fourth Year Project

Tim Stuart

timothy.stuart@oriel.ox.ac.uk

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Project Aim

To model and quantitatively measure the affect of the pericytes response on Alzheimer's dementia (AD).

Outline

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 - Overview
 - Vascular anatomical network (VAN)
 - Flow model equations
 - Pericyte response
 - Amyloid Beta (AB) accumulation
 - Neuron and pericyte health models
- 4 Results
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Research

- Failure in trials targeting the amyloid cascade hypothesis.
- Push for innovative modelling methods.
- Blood flow modelling offers hope.
- Pericytes recently emerging as a vital component of microvasculature blood flow control.
- Further reinforcing of the pericytes having a potential role in Alzheimer's Dementia.

Model overview

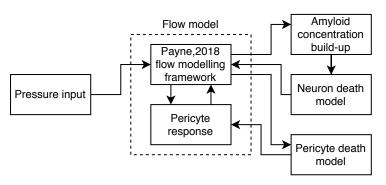


Figure: Block diagram illustrating structure of model.

VAN

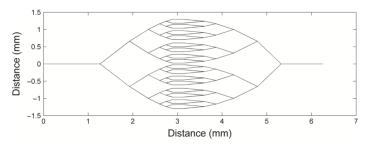


Figure: Diagram demonstrating the arrangement of the vessel network Payne and Lucas (2018).

Flow Model Equations

From Payne and Lucas (2018):

$$\alpha_{t}V_{t}\frac{\partial p_{t}}{\partial t} = \frac{2\pi KRL}{h} \left(\frac{1}{2}(p_{b,in} + p_{b,out}) - p_{t}\right) - MV_{t}$$
 (1)

$$V_{b} \frac{1}{2} \left(\frac{\partial S_{in}}{\partial t} + \frac{\partial S_{out}}{\partial t} \right) + \frac{1}{2} \left(Q_{in} + Q_{out} \right) \left(S_{out} - S_{in} \right)$$

$$= -\frac{2\pi KRL}{hc_{Hb}H} \left(\frac{1}{2} (p_{b,in} + p_{b,out}) - p_{t} \right) \quad (2)$$

Resistor analogy:

$$\Delta p_{\text{network}} = Q_{\text{network}} \cdot R_{\text{network}} \tag{3}$$

Pericyte response

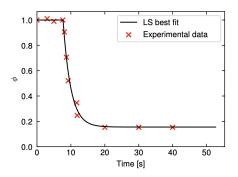


Figure 4.4: Fit to experimental data of the pericyte response in full ischaemia.

for:

$$\phi(t) = \begin{cases} 1 & \text{if } t <= \tau_{\mathsf{d}}, \\ \phi_{\mathsf{FI}} + \frac{1 - \phi_{\mathsf{FI}}}{\tau_{\mathsf{p}}(t - \tau_{\mathsf{d}}) + 1} & \text{if } t > \tau_{\mathsf{d}}. \end{cases}$$
(4)

Pericyte response cont.

Scaling function:

$$\phi_{min} = 1 - \alpha^{0.25} (1 - \phi_{FI}) (1 - Q_{norm})$$
 (5)

Pericyte governing equation:

$$\tau_{\mathsf{p}} \frac{d\phi}{dt} = -\phi(t - \tau_{\mathsf{d}}) + Q_{\mathsf{norm}}(1 - \phi_{\mathsf{min}}) + \phi_{\mathsf{min}} \tag{6}$$

Boundary conditions satisfied when all pericytes respond to flow stimulus ($\alpha=1$):

$$\phi_{\min} = \phi_{\mathsf{FI}} \quad \text{for} \quad Q_{\mathsf{norm}} = 0$$
 (7)

$$\phi_{\min} = 1 \quad \text{for} \quad Q_{\text{norm}} = 1$$
 (8)

AB accumulation

$$\tau_{c} \frac{dc}{dt} c = R - c(k + Q_{norm})$$
 (9)

Health models

$$A_{\mathsf{p}} \xrightarrow[k_{\mathsf{p}}^{-}]{k_{\mathsf{p}}^{+}} V_{\mathsf{p}} \xrightarrow[k_{\mathsf{p}}^{-}]{k_{\mathsf{p}}^{+}} D_{\mathsf{p}} \qquad A_{\mathsf{n}} \xrightarrow[k_{\mathsf{n}}^{-}]{k_{\mathsf{n}}^{+}} V_{\mathsf{n}} \xrightarrow[k_{\mathsf{n}}^{-}]{k_{\mathsf{p}}^{+}} D_{\mathsf{n}}$$

(a) Pericyte health model.

(b) Neuron health model.

Figure: The health models set up.

$$\frac{dA}{dt} = -k^{+}.A + k^{-}.V \tag{10}$$

$$\frac{dA}{dt} = -k^{+}.A + k^{-}.V$$

$$\frac{dV}{dt} = k^{+}.A - k^{-}.V - k^{+}.V$$
(10)

$$\frac{dD}{dt} = k^{-}.V \tag{12}$$

$$1 = A + V + D \tag{13}$$



AB accumulation cont.

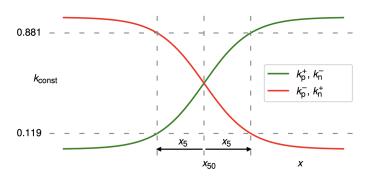


Figure 4.6: Illustration of the constant values set in the pericyte and neuron health models.

General case:

$$k(x) = \frac{k_{\text{const}}}{2} \left(1 \pm \tanh\left(\frac{x - x_{50}}{x_5}\right) \right) \tag{14}$$

Neuron health model

$$k_{\rm n}^+(c) = \overline{k}_{\rm n} \frac{1}{2} \left(1 + \tanh\left(\frac{c - c_{50}}{c_5}\right) \right) \tag{15}$$

$$k_{\mathsf{n}}^{-}(c) = \overline{k}_{\mathsf{n}} \frac{1}{2} \left(1 - \tanh\left(\frac{c - c_{50}}{c_{5}}\right) \right) \tag{16}$$

$$M = A_{\mathsf{n}} M_{\mathsf{hill}} \tag{17}$$

Pericyte health model

$$\hat{p}_{t} = \frac{1}{\sum_{i=1}^{N} V_{t,i}} \sum_{i=1}^{N} p_{t,i} V_{t,i}$$
(18)

$$k_{\rm p}^{+}(\hat{p}_{\rm t}) = \overline{k}_{\rm p} \frac{1}{2} \left(1 - \tanh\left(\frac{\hat{p}_{\rm t} - \hat{p}_{\rm t,50}}{\hat{p}_{\rm t,5}}\right) \right)$$
 (19)

$$k_{\mathbf{p}}^{-}(\hat{p}_{t}) = \overline{k}_{\mathbf{p}} \frac{1}{2} \left(1 + \tanh\left(\frac{\hat{p}_{t} - \hat{p}_{t,50}}{\hat{p}_{t,5}}\right) \right)$$
 (20)

$$\tau_{\mathsf{p}} \frac{d\phi}{dt} = -\phi(t - \tau_{\mathsf{d}}) + A_{\mathsf{p}} \Big[f(1 - \phi_{\mathsf{min}}) + \phi_{\mathsf{min}} \Big] \tag{21}$$

Model development conclusion

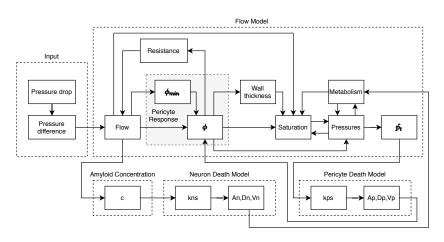


Figure: Full model block diagram of all parameters

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Numerical solver

Modified Runge-Kutta 4th order method:

$$\begin{aligned} \frac{dy_{i}}{dt} &= f(t,y), & y &= \left[y_{1} \quad y_{2} \quad \dots \quad y_{k}\right], \\ y(t_{0}) &= y_{0}, & a &= \left[a_{1} \quad a_{2} \quad \dots \quad a_{k}\right], \\ y_{n+1} &= y_{n} + \frac{1}{6}h(a+2b+2c+d), & b &= \left[b_{1} \quad b_{2} \quad \dots \quad b_{k}\right], \\ t_{n+1} &= t_{n} + h, & c &= \left[c_{1} \quad c_{2} \quad \dots \quad c_{k}\right], \\ a_{i} &= f(t_{n}, y_{n}), & d &= \left[d_{1} \quad d_{2} \quad \dots \quad d_{k}\right], \\ b_{i} &= f\left(t_{n} + \frac{h}{2}, y_{n} + h\frac{a}{2}\right), & \\ c_{i} &= f\left(t_{n} + h, y_{n} + hd\right). & \end{aligned}$$

Results

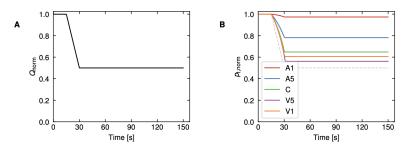


Figure 5.5: Base flow model results.

A: normalised flow rate response; B: the distribution of the normalised partial tissue pressure of oxygen surrounding a selection of vessels.

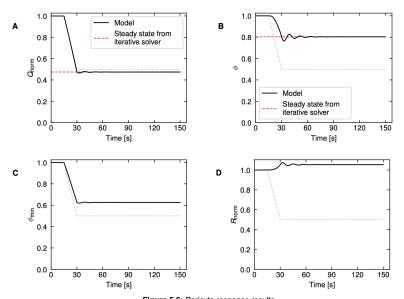


Figure 5.6: Pericyte response results.

A: normalised flow rate response; B: normalised capillary bed diameter response; C: ϕ_{\min} scaling factor;
D: normalised total resistance of the network.

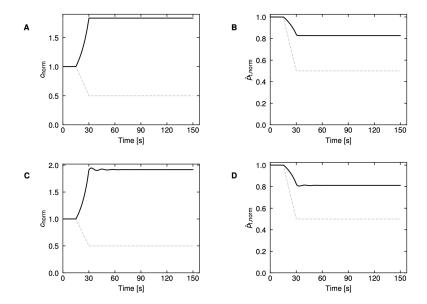


Figure 5.7: Health metrics. **A** & **B**: AB concentration and $\hat{\rho}_{t,norm}$ plots for the flow model; **C** & **D**: AB concentration and $\hat{\rho}_{t,norm}$ plots for the pericyte response model.

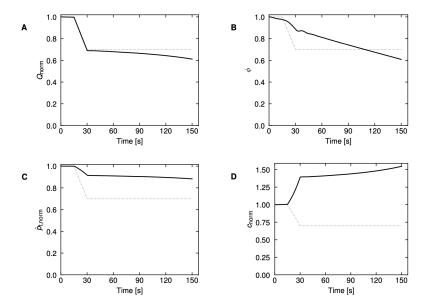


Figure 5.8: Pericyte health model results. **A**: normalised flow rate response; **B**: ϕ response; **C**: \hat{p}_t response; **D**: normalised AB concentration response; **E**: normalised vessel p_t response; **F**: pericyte health model states.

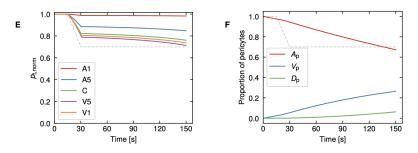


Figure 5.8: Pericyte health model results.

A: normalised flow rate response; B: ϕ response; C: \hat{p}_t response; D: normalised AB concentration response; E: normalised vessel p_t response; F: pericyte health model states.

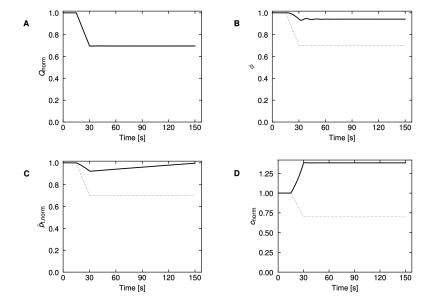


Figure 5.9: Neuron health model results. **A**: normalised flow rate response; **B**: ϕ response; **C**: $\hat{\rho}_t$ response; **D**: normalised AB concentration response; **E**: normalised vessel p_t response; **F**: neuron health model states.

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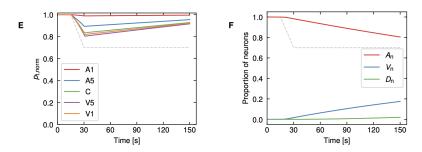


Figure 5.9: Neuron health model results.

A: normalised flow rate response; \mathbf{B} : ϕ response; \mathbf{C} : $\hat{\rho}_t$ response; \mathbf{D} : normalised AB concentration response; \mathbf{E} : normalised vessel ρ_t response; \mathbf{F} : neuron health model states.

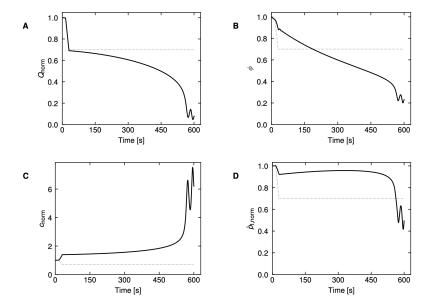


Figure 5.11: Default values results.

A: normalised flow rate response; B: ϕ response; C: normalised AB concentration response; D: \hat{p}_t response; E: pericyte health model states; F: neuron health model states.

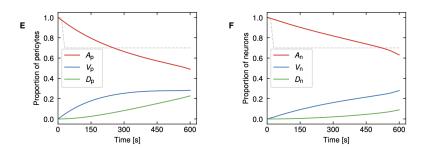


Figure 5.11: Default values results.

A: normalised flow rate response; \mathbf{B} : ϕ response; \mathbf{C} : normalised AB concentration response; \mathbf{D} : \hat{p}_t response; \mathbf{E} : pericyte health model states; \mathbf{F} : neuron health model states.

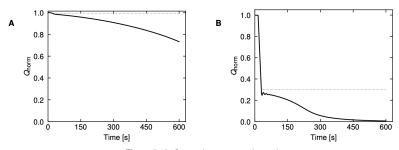


Figure 5.12: Comparing pressure drop values.

A: Flow rate plot for low pressure drop (0.01); B: Flow rate plot for high pressure drop (0.7).

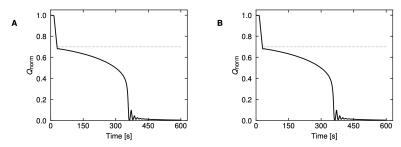


Figure 5.13: Comparing delay for α = 0.5. **A**: Flow rate plot for low delay (0); **B**: Flow rate plot for high delay (7.62).

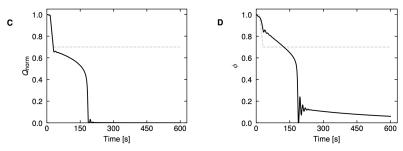


Figure 5.14: Showing high α results. **A**: Flow rate plot for high alpha (0.9); **B**: ϕ plot for high alpha (0.9);

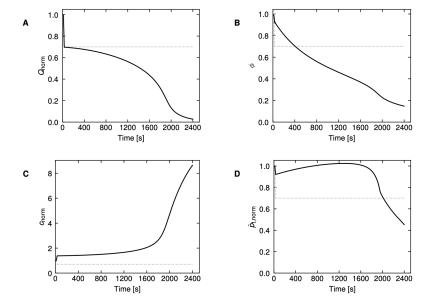
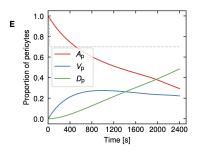


Figure 5.15: Slow response results.. **A**: normalised flow rate response; **B**: ϕ response; **C**: normalised AB concentration response; **D**: \hat{p}_1 response; E: pericyte health model states; F: neuron health model states.

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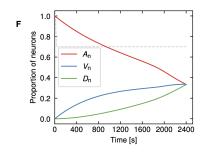


Figure 5.15: Slow response results..

A: normalised flow rate response; **B**: ϕ response; **C**: normalised AB concentration response; **D**: \hat{p}_t response; **E**: pericyte health model states; **F**: neuron health model states.

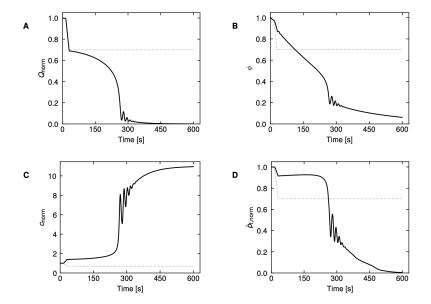


Figure 5.16: Accelerated response results.. **A:** normalised flow rate response; **B:** ϕ response; **C:** normalised AB concentration response; **D:** \hat{p}_t response; **E:** pericyte health model states; **F:** neuron health model states.

$$\hat{p}_{t,50} = \hat{p}_{t,baseline}$$
 (22)
$$\hat{p}_{t,5} = 0.1.\hat{p}_{t,baseline}$$
 (23)

$$\hat{p}_{t,5} = 0.1.\hat{p}_{t,\text{baseline}} \tag{23}$$

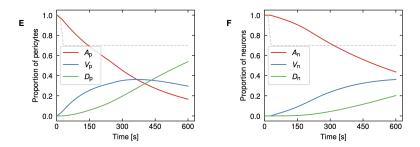


Figure 5.16: Accelerated response results..

A: normalised flow rate response; **B**: ϕ response; **C**: normalised AB concentration response; **D**: $\hat{\rho}_t$ response; E: pericyte health model states; F: neuron health model states.

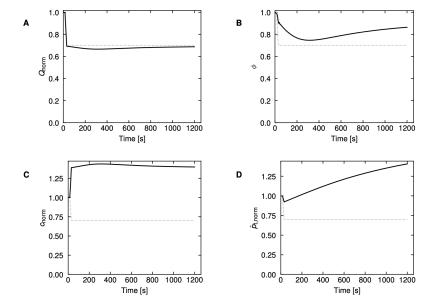


Figure 5.17: Second equilibrium results. **A:** normalised flow rate response; **B:** ϕ response; **C:** normalised AB concentration response; **D:** $\hat{\rho}_t$ response; **E:** pericyte health model states; **F:** neuron health model states.

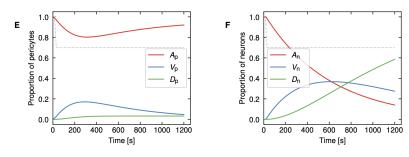


Figure 5.17: Second equilibrium results. **A:** normalised flow rate response; **B:** ϕ response; **C:** normalised AB concentration response; **D:** \hat{p}_t response; **E:** pericyte health model states; **F:** neuron health model states.

Conclusion

Results takeaways:

- Importance of pericyte health.
- Sacrificing neuron health to protect pericyte health

Areas for development:

- Confirming the site of contraction (capillary versus arterioles) from improved imaging methods and more studies
- Inclusion of likely upstream propogation of contracile signal
- Inclusion of hemodynamic or autoregulatory responses
- Experiment with different inputs to the model
- Longer duration simulations
- Improved numerical solver for the stiff nature of the system