Leibniz Institute for Natural Product Research and Infection Biology - Hans Knöll Institute

# Simulation of Immune Cell Deficiencies in a State-Based Virtual Infection Model of Human Whole-Blood Assays for Candida albicans

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#### Human Whole-Blood Infection Assay

The opportunistic human fungal pathogen *Candida albicans* can enter the blood stream and causes severe systemic infections such as sepsis. Whole-blood infection assays with C. albicans yield time resolved data that were used to generate a non-spatial state-based virtual infection model and to estimate the model parameters [1]. Finally, we can quantify different non-spatial properties of the immune response against *C. albicans* in human blood. [1] Hünniger and Lehnert et al. (2014), PLOS Comp. Biol. 10(2), e1003479.

#### **Bottom-up Modeling Approach**

The non-spatial state-based model (SBM) is part of a bottom-up modeling approach that comprises the generation of different mathematical models and the estimation of model parameters [2]. The models focus on different properties of the immune response during C. albicans infection in human blood. [2] Lehnert and Timme et al. (2015), Frontiers in Microbiology 6(608).





 $C_{KE} =$  extracellularly killed yeast cells  $C_{AR}$  = alive yeast cells that became resistant  $C_{KR}$  = killed yeast cells that became resistant  $G_{i,j}$  = granulocytes with *i* alive and *j* killed yeast cells  $M_{i,j}$  = monocytes with *i* alive and *j* killed yeast cells



#### Extracellular Killing

0.01!

0.01

0.005

$$\kappa_{\mathbf{EK}}(t=n\Delta t) = \bar{\kappa}_{EK} \sum_{m=0}^{n} \frac{N_{GP}(t=m\Delta t)}{G_{0,0}(0)} \exp(-\gamma \Delta t(n-m))$$



 $\bar{\kappa}_{EK}$  constant transition rate  $N_{GP}(t)$  number of first-time phagocytosis  $\gamma$  half-life time of the effect of antimicrobial factors



#### Flow Chart of SBM Simulation Algorithm: In each time-step $\Delta t$ , all individuals are tested for possible state transitions. Individuals of extracellular alive and killed C. albicans states, i.e. $C_{AE}$ and $C_{KE}$ , respectively, are tested for becoming resistant and for extracellular killing. Individuals of immune cell states $(M_{i,j} \text{ or } G_{i,j})$ are tested for phagocytosis and for intracellular killing of C. albicans cells.

#### **Parameter Estimation**

#### **Estimation of Transition Rate Values** Simulated Annealing Based on Metropolis Monte-Carlo:



- compare simulated and experimen-tal data
- always accept parameter values that improve fitting
- accept parameter values that impair fitting based on Boltzmann distribution

— simulated data --- experimental data

## **Prediction of Immune Cell Dynamics**

### **Quantification of Immune Response**





### **Predictions on Immune Cell Deficiencies**



 $5 \hspace{0.1 cm} 10^{4} \hspace{0.1 cm} 2 \hspace{0.1 cm} 5 \hspace{0.1 cm} 10^{5} \hspace{0.1 cm} 2 \hspace{0.1 cm} 5 \hspace{0.1 cm} 10^{6} \hspace{0.1 cm} 2$ 



 $\rightarrow$  phagocytosis by PMN occurs with higher rate than by monocytes

 $\rightarrow$  killing of *C. albicans* in human blood is mainly mediated by PMN PMN kill fungal cells intracellularly  $(C_{GKG})$  and extracellularly  $(C_{EKG})$ 

 $\rightarrow$  monocytopenia: lack of monocytes is completely compensated by PMN

 $\rightarrow$  neutropenia: lack of PMN can be compensated up to  $5 \times 10^5 PMN/ml$  $\rightarrow$  confirms threshold for severe clinical neutropenia

Resulting Transition Rates:						
		rate	SD [%]		rate	SD [%]
	$\phi_G$	2.83 $\cdot 10^{-2} \text{ min}^{-1}$	1.7	$\  \kappa_M$	3.59 $\cdot 10^{-2} \text{ min}^{-1}$	10.4
	$\phi_{G^{\star}}$	4.75 $\cdot 10^{-2} \text{ min}^{-1}$	8.1	$\kappa_G$	<b>4.69</b> $\cdot 10^{-2}$ min <sup>-1</sup>	9.1
	$\phi_M$	$1.25 \cdot 10^{-2} \text{ min}^{-1}$	5.9	$\mid  ho$	0.45 $\cdot 10^{-2} \text{ min}^{-1}$	4.2
	$\gamma$	$1.93 \cdot 10^{-2} \min^{-1}$	14.3	$\  \kappa_{EK}^-$	26.07 $\cdot 10^{-2} \min^{-1}$	8.7

## Outlook

• application to patient blood

• application to whole-blood infection with other pathogens and in other organisms

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