The acquisition of additional feedback loops optimizes and speeds up the response of <u>Quorum Sensing</u>

> Marco Fondi IBCWG August 25, 2022

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Modelling QS regulation

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Quorum sensing

Bacterial QS is a cell-to-cell communication system in which specific signals are activated to coordinate, for example, pathogenic behaviors and help bacteria collectively respond to perturbations.



It **regulates** bacteria biofilm formation and virulence in general.

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The V.fischeri LuxIR system



LuxR is an autoinducer (AI)-dependent positive regulator of the lux operon, and LuxI produces the AI molecule, 3-oxo-hexanoyl-L-homoserine lactone

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Bistability and robustness in QS regulation



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Multiple QS regulation system and their cross-talk in Burkholderia



O'Grady et al. 2009, BMC Genomics



Le Guillouzer et al. 2018

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The CciIR regulators are located on the cci genomic island



Baldwin et al. 2004

Conserved

rotein-like

Amino acid

The *Burkholderia cepacia* epidemic strain marker is part of a novel genomic island encoding both virulence and metabolism-associated genes in *Burkholderia cenocepacia*

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Aims and motivation

The inclusion of a regulatory system (CciIR) inside a genomic island (*cci*) represents an extraordinary example of the plasticity of the cellular transcriptional network and an exceptional occasion to study the effect of alternative regulatory architectures on the expression of the resulting phenotypic trait.

- Which is the actual <u>distrubution</u> of the *cci*-encoded CciIR regulatory system in *Burkholderia*?
- Which are the <u>evolutionary advantages</u> provided by the acquisition of additional control over bacterial regulation of QS?

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- 289 Burkholderia completely sequenced genomes probed using B. cenocepacia J2315 cci island genes (using Bidireactional Best Hit method)
- Rows (genomes) clustered according to shared ANI values
- In B. mallei, B. pseudomallei and B. thalilandiensis the complete set of cci genes is never found. In the other cluster (hereinafter cci -group the distribution is patchy and includes (22) microbes that harbour more than 50% of the reference cci genes and others (93) possessing less than 50% of the reference cci genes.

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Two alternative QS regulation architectures: core



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Two alternative QS regulation architectures: complete



Aims and motivation

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- Which is the actual distrubution of the *cci*-encoded CciIR regulatory system in *Burkholderia*?
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A mathematical model accounting for the two regulatory schemes

$\emptyset \xrightarrow{\alpha OACP} OACP$		
	$CCII \xrightarrow{\delta} \emptyset$	
$CEPI \xrightarrow{\delta} \emptyset$	$CCIR^* \xrightarrow{\delta} \emptyset$	
$CEPR \xrightarrow{\delta} \emptyset$	$C_a{}^I \xrightarrow{\delta} \emptyset$	
$CEPR^* \xrightarrow{\delta} \emptyset$	actor a ^I ^k on,CCIR* actor*	
$OACP \xrightarrow{\delta} \emptyset$	$CCIR + C_{\epsilon} \xrightarrow{k_{off,CCIR^*}} CCIR$	
$Cs^{I} \xrightarrow{\delta} \emptyset$	$V_{max,CCII} \cdot OACP$	
$CEPR + C_s^I \xrightarrow{k_{on,CEPR^*}} CEPR^*$	$OACP + CCII \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \$	+ CCII
		R
$CP + CEPI \xrightarrow{V_{max,CEPI \cdot OACP}} Cs^{I} + CEPI$	$C_s^I \xleftarrow{\alpha_{C_s}} C_s^E$	
$\frac{\beta_2}{\frac{1+\left(\frac{CCIR^*}{CCIR^*}\right)^m}{1+\left(\frac{CCPR^*}{K}\right)^w}} + \frac{\beta_1 \cdot (CEPR^*)^w}{k_1 + (CEPR^*)^w}$	$Ce^I \xleftarrow{\alpha_{Ce}} Ce^E$	All models are wrong
$\emptyset \xrightarrow{(\kappa_2)} CEPI$	$C_s \xrightarrow{E} \xrightarrow{\delta} \emptyset$	but some are useful
$\emptyset \xrightarrow[1+\left(\frac{CEPR^*}{k_3}\right)^n CEPR$	$C_{c}^{E} \xrightarrow{\delta} \emptyset$	(George E. P. Box)
$\emptyset \xrightarrow{\beta_2} CCII$	$\emptyset \xrightarrow{\gamma_{C_s}} C_s^E$	
$CCIR \xrightarrow{\delta} \emptyset$	$\emptyset \xrightarrow{\gamma_{C_{6}}} C_{6}^{E}$	MATLAB°
		*

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Simulating the system to its steady state

We simulated the behaviour of the system for 1200 minutes upon its activation (all initial concentrations set to 0) and evaluated the dynamics of the main species included in the model



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The two circuits differ in their response time (RT) The RTs are 69 and 264 minutes in the case of the complete and the core models, respectively

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We can now use the model to address an important question: How does QS respond to external parameters variation?



Local sensitivity analysis:

$$S_{ij} = \frac{dx_i(t_n)}{dp_j}$$
(12)

 the model is robust to variations in the values of most parameters as local sensitivity is mostly maintained in the range of 1 * 10⁻²/1 * 10⁻⁴. Exceptions are represented by V_{max,CEP1}, αOACP, β1, β2, δ, γ_{C8,colony}, γ_{C6,colony} and V_{max,Cci1} for the complete model

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We repeated the simulations described above for different values of δ . Concerning the response time of CepI, we found a strong influence of δ on the RT of the complete and core models.



Response time in the two configurations

The <u>complete</u> model provides a faster response than the <u>core</u> one. This difference is higher at low growth rates

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Does the AI concentration influence the response?



- In the <u>core</u> model, with higher concentrations of AI, CepI is predicted to reach levels that are very far from the optimal, steady state concentration

Optimization in respor	nse to AI concentration (1)		
The complete model i	s optimized in response to	external AI	
concentraiton			
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Conclusions



The *complete* model has a shorter RT

The efficacy of the *complete* model over the *core* one is maximized in two conditions: i) low growth rates and ii) high cell density

Low growth rates are typically encountered by free living bacteria exposed to nutritional stress during the establishment of **host infection** (restricted nutritional conditions with low cell density). Additionally, combined low growth rates and high cell density are encountered by bacteria that live in **biofilms**.

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Working hypothesis: is the complete scheme helpful during infections?

We speculate that the additional feedback loops provided by the CciIR regulation system may provide an evolutionary advantage to the harbouring strains during the onset and maintenance of **host infections**.

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University of Florence Alessio Mengoni Elena Perrin

University of Perugia Francesca Di Patti

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Read more on BioRxiv (same title)...

Florence Computational Biology Group



Open positions in the lab!

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Experimental validation

1. Deletion of cepl, cepR, ccil and cciR and of both genes



2. Insertion of reporter genes downtream of the promoters of the two inducers



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The regulation of QS and QS-related processes has been almost exclusively interpreted as (cell) density-dependent feature. However, mounting evidence suggests that growth rate, in addition to cellular concentration, plays a major role in triggering this complex phenotypic response.

- 🗉 Vibrio fischeri
- Pseudomonas aeruginosa
- B. glumae
- B. cenocepacia



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FIG. 3. Effect of specific growth rate upon the production of lipsue by *B*, espacia in an iren-limited, chemically defined simple salts medium. Lipsus content was expressed as productivity under oxygen-replete (○) or oxygen-depleted (●) conditions.

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FIG. 2. Effect of specific growth rate upon the production of protease by *B*, cspecia in an iron-limited, chemically defined simple softs medium. Processe content was expressed as productivity under oxygen-repleted (O) or oxygen-depleted (O) conditions.

Cepl vs. CepR and Cepl vs. CepR* in the phase plane



Optimization in response to AI concentration (2)

The complete model has a "simpler" phase plane

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Stochastic simulations

Heterogeneity is ubiquitous across all domains of life. In microbes phenotypic emerges as a result of multiple factors such as fluctuations in the microenvironment, stochasticity in gene expression.



Smaller fluctuations in the *core* configuration. Better response to fluctuating environmental conditions?

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doi:10.1016/S0022-2836(02)00994-4 available online at http://www.idealbrary.com on IDE 1 J. Mol. Biol. (2002) 323, 785-793

JMB

Negative Autoregulation Speeds the Response Times of Transcription Networks

Nitzan Rosenfeld¹, Michael B. Elowitz² and Uri Alon^{1*}



