

University of Dundee

# Competition and coexistence in bacterial range expansion: the role of founder cells and spatial heterogeneities

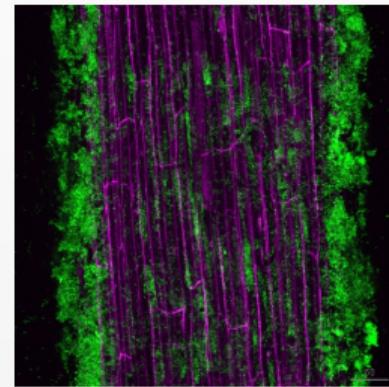
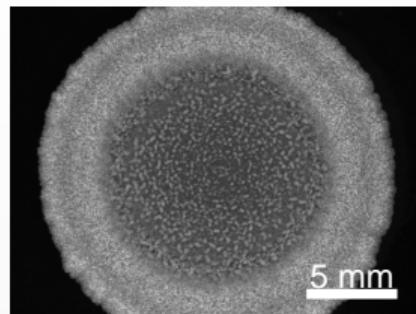
## Microbial communities: current approaches and open challenges

11/10/2022

*Lukas Eigentler*

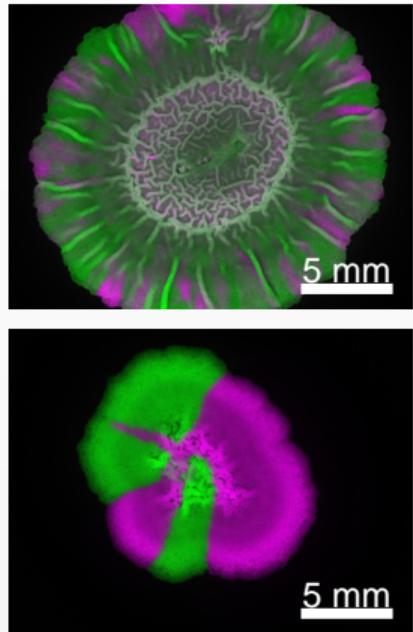
# Biofilms

- Bacterial biofilms are surface-adhering multicellular collectives embedded in a self-produced extracellular matrix.
- Biofilms can have both beneficial and detrimental effects on the surrounding environment.
- Example: the soil-dwelling bacterium *Bacillus subtilis* forms biofilms on the roots of plants, where some strains promote the growth of plants.
- To fully realise their potential as biocontrol agents, **strains need to be capable of coexisting with (or outcompeting) other biofilm-forming strains in the rhizosphere.**



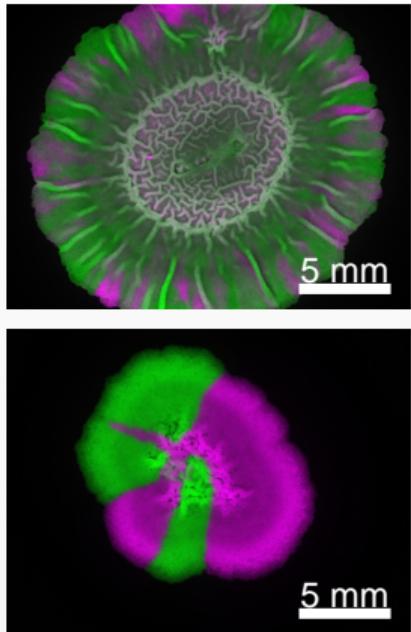
# Competition within biofilms

- Competition in biofilms is underpinned by kin discrimination.
- Many mechanisms of kin discrimination require spatial co-location of strains.
- Take a step back: **need to understand the role of spatial structure first.**



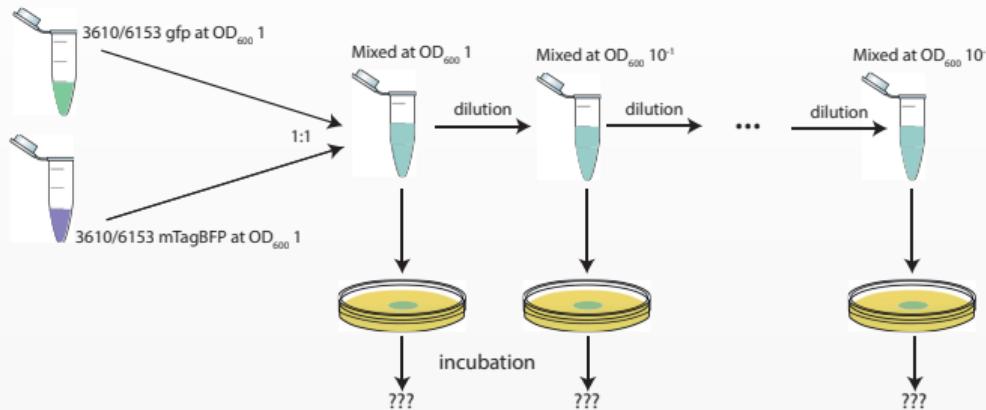
# Competition within biofilms

- Questions: How does spatial structure arise in biofilms with low initial population density and how does it affect competitive interactions?
- Spatial structure is best studied using **isogenic strains**: all other competitive mechanisms (e.g. kin discrimination) are excluded from the model system by design.
- ⇒ Then extend to strain combinations with antagonistic interactions.



# Methods

## Experimental assay:



## Tested for

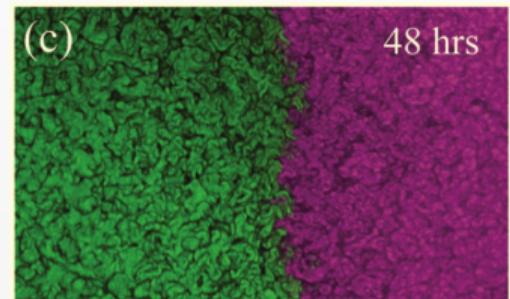
- *B. subtilis* NCIB3610 ("standard" lab strain).
- *B. subtilis* NRS6153 (isolated from garden soil in Tayport, Fife, UK).

# Methods

Mathematical model for isogenic strain pair:

$$\frac{\partial B_1}{\partial t} = \nabla \cdot ((1 - (B_1 + B_2)) \nabla B_1) + B_1 (1 - (B_1 + B_2)),$$
$$\frac{\partial B_2}{\partial t} = \nabla \cdot ((1 - (B_1 + B_2)) \nabla B_2) + B_2 (1 - (B_1 + B_2)).$$

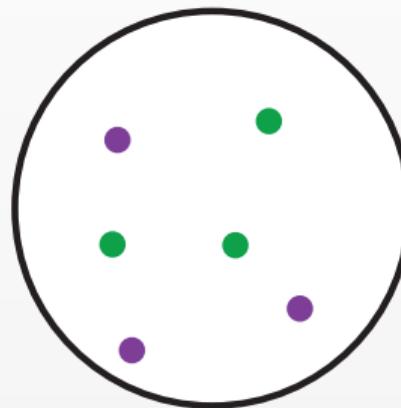
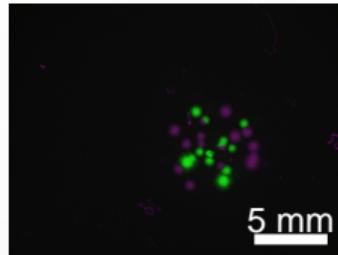
- Circular domain  $\Omega = \{x \in \mathbb{R}^2 : \|x\| \leq R\}$ .
- Logistic growth
- Diffusion with density-dependent diffusion coefficient, motivated by experimental observation that initially separated colonies abut rather than merge<sup>1</sup>.



<sup>1</sup>Matoz-Fernandez, D. et al.: *Soft Matter* 16.13 (2020)

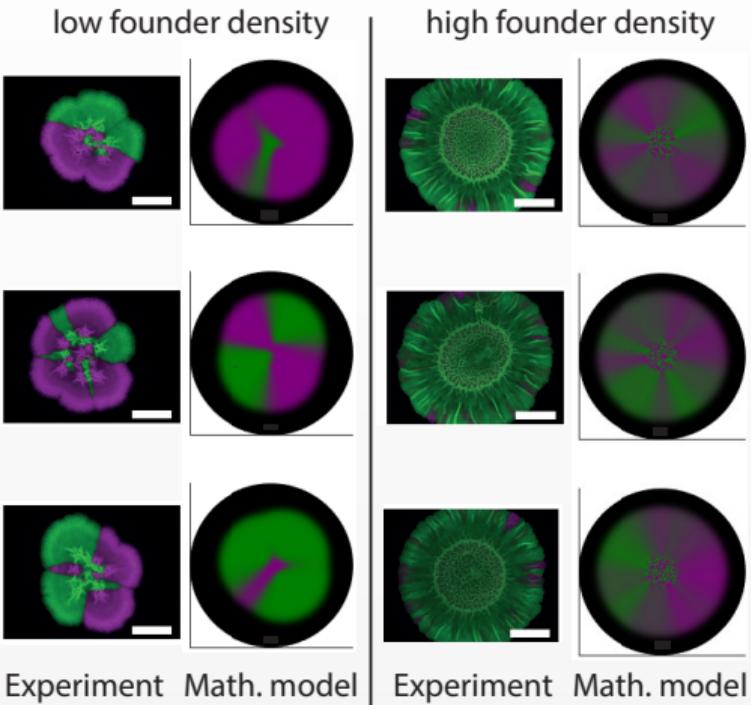
# Initial conditions

- What are appropriate initial conditions?
- In experiments, **cells settle at random locations** within the initial spot and grow to small micro-colonies.
- In the model, we position **initial “cell patches” at random locations** in the domain centre  $\Omega_0 = \{x \in \mathbb{R}^2 : \|x\| \leq R_0\} \subset \Omega$ .
- Each model patch represents 1 microcolony  $\Rightarrow$  tool to modulate founder density.



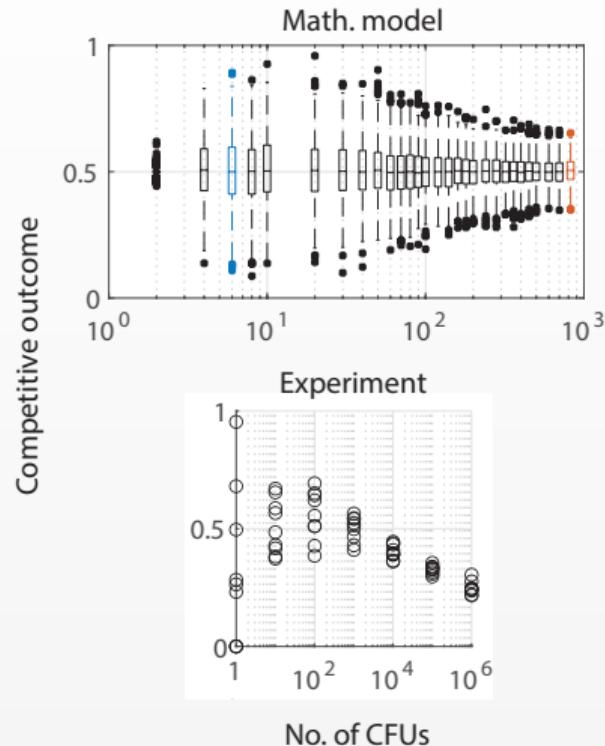
# Variability in competitive outcome

- High founder density: no spatial structure and initial strain ratio consistently determines competitive outcome.
- Low founder density: spatial segregation occurs. Large variability in competitive outcome for fixed initial strain ratio.
- Founder density significantly affects phenotype and variability in competitive outcome.



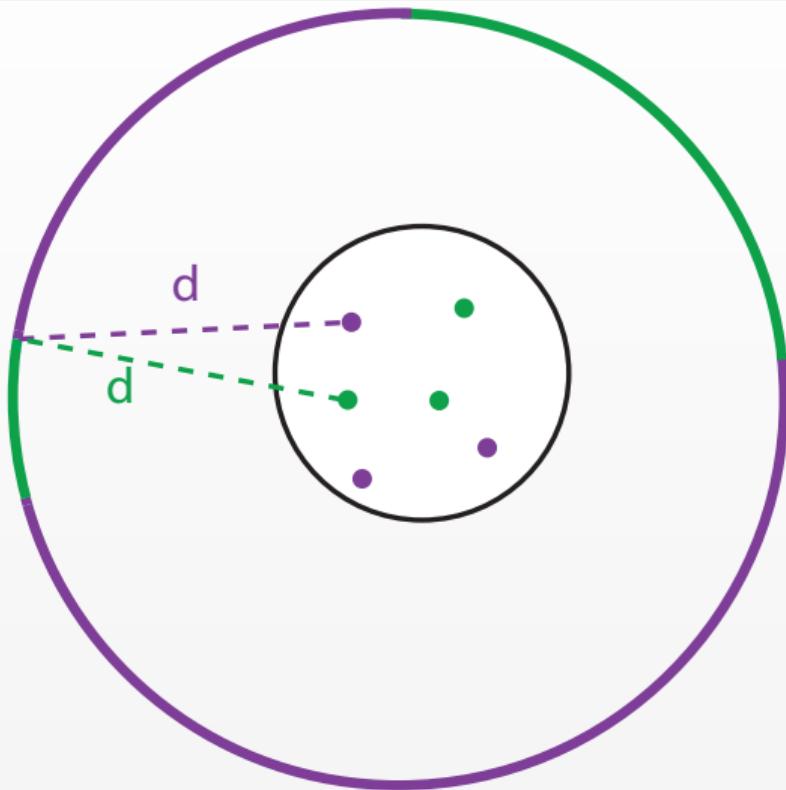
# Variability in competitive outcome

- Founder density significantly affects phenotype and variability in competitive outcome.
- Variability increases with decreasing founder density.
- Note the computational power of the mathematical model: 1000 model simulations each vs 12 technical replicates each of experimental assay.



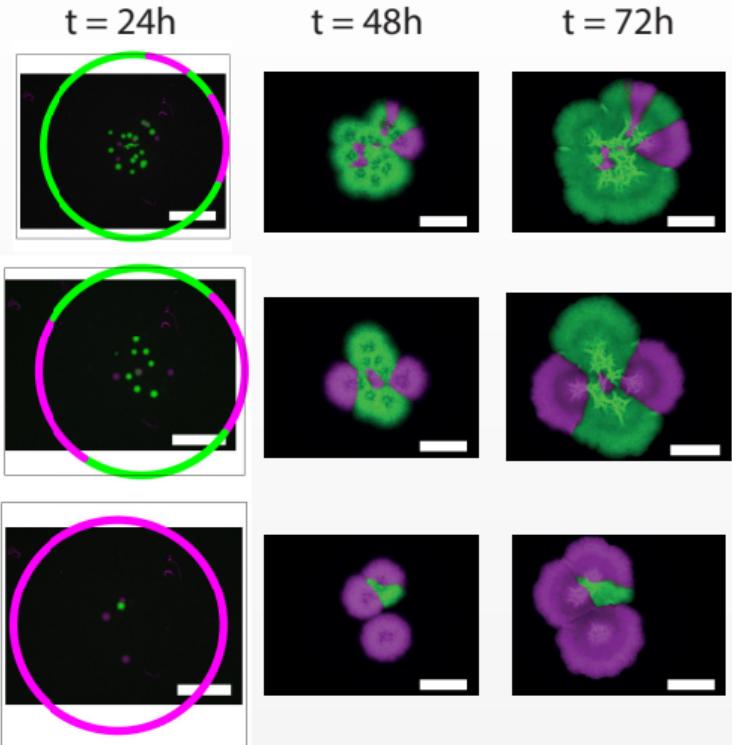
# Disentangling variability

- Hypothesis: only initial patches that can drive the biofilm's radial expansion contribute to outcome density.
- We define a quantity that, based on the initial cell locations, **measures a strain's "access to free space"**



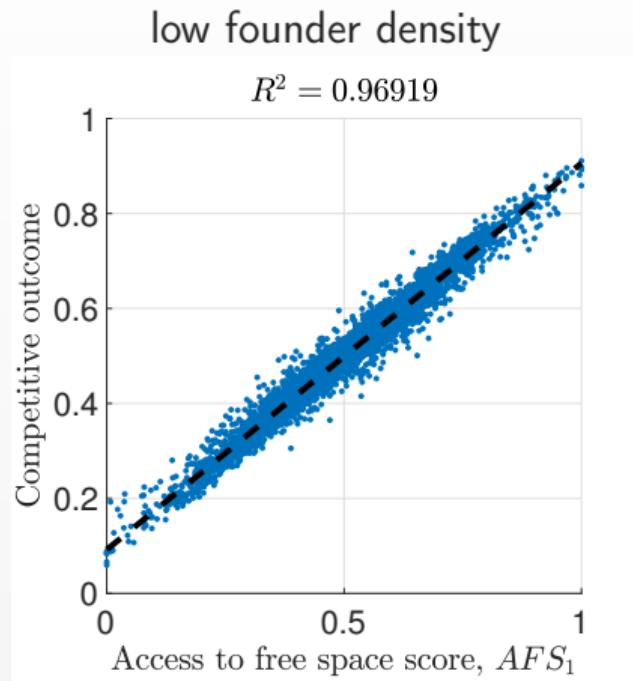
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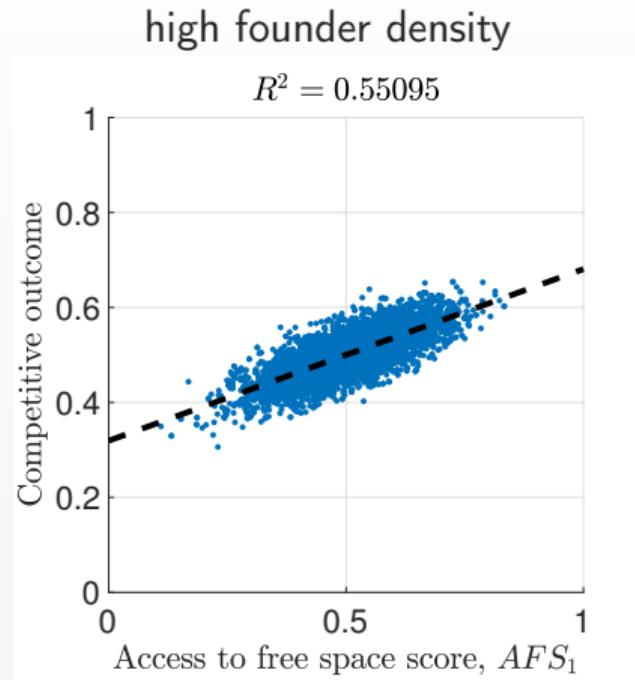
# Access to free space predicts outcome

- Access to free space determines competitive outcome in the absence of any other competitive dynamics (isogenic strains).



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- Access to free space determines competitive outcome in the absence of any other competitive dynamics (isogenic strains).
- Slope of relation between access to free space and competitive outcome depends on founder density.



## Non-isogenic strains

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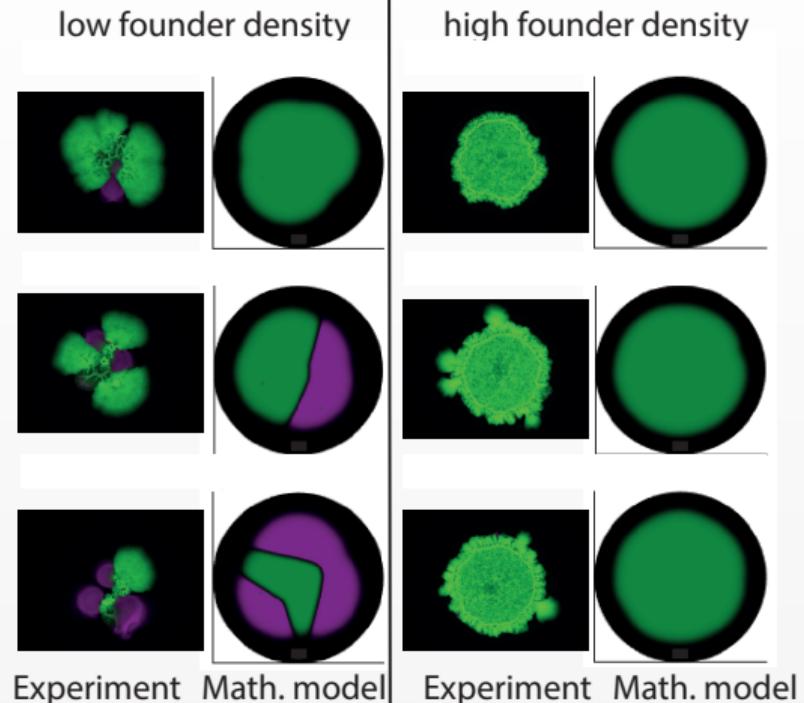
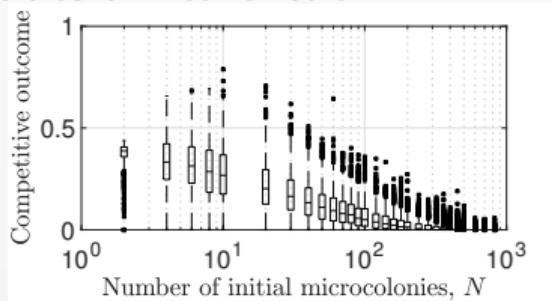
- Do these results also hold if **strains are non-isogenic and interact through local antagonisms?**

$$\frac{\partial B_1}{\partial t} = \nabla \cdot \left( \left( 1 - \frac{B_1 + B_2}{k} \right) \nabla B_1 \right) + B_1 \left( 1 - \frac{B_1 + B_2}{k} \right) - B_1 B_2,$$
$$\frac{\partial B_2}{\partial t} = \nabla \cdot \left( d \left( 1 - \frac{B_1 + B_2}{k} \right) \nabla B_2 \right) + r B_2 \left( 1 - \frac{B_1 + B_2}{k} \right) - c B_2 B_1.$$

Nondimensional model, i.e.  $d$ ,  $r$ ,  $c$  are ratios of corresponding dimensional parameters.

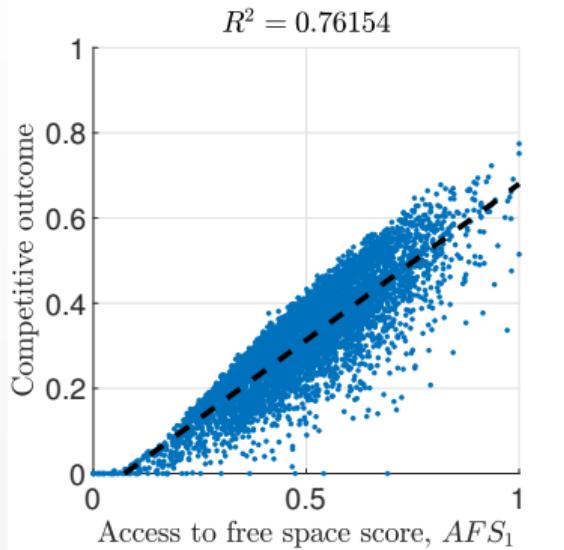
# Non-isogenic strains

- High founder density: competitive exclusion.
- Low founder density: spatial segregation enables coexistence.
- Decreases in founder density cause (i) increased variability in competitive outcome, (ii) higher (on average) densities of weaker strain.



# Access to free space predicts outcome

- Access to free space remains a reliable predictor of competitive outcome for low founder densities.
- **Competition for space is the dominant mode of interaction for low founder densities.**



# Impact of spatial heterogeneity

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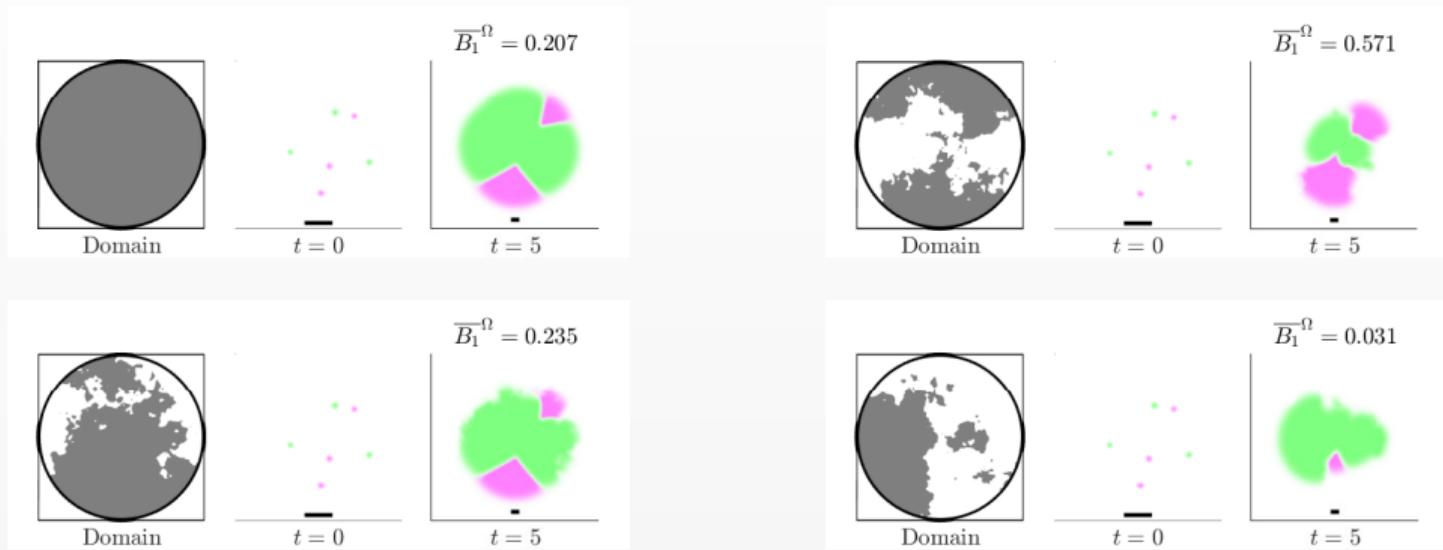
Q: What if environmental conditions are spatially heterogeneous?

$$\frac{\partial B_1}{\partial t} = \nabla \cdot \left( \mathbf{d}_1(\mathbf{x}) \left( 1 - \frac{B_1 + B_2}{k} \right) \nabla B_1 \right) + \mathbf{r}_1(\mathbf{x}) B_1 \left( 1 - \frac{B_1 + B_2}{k} \right) - c_{12} B_1 B_2,$$

$$\frac{\partial B_2}{\partial t} = \nabla \cdot \left( \mathbf{d}_2(\mathbf{x}) \left( 1 - \frac{B_1 + B_2}{k} \right) \nabla B_2 \right) + \mathbf{r}_2(\mathbf{x}) B_2 \left( 1 - \frac{B_1 + B_2}{k} \right) - c_{21} B_1 B_2.$$

# Impact of spatial heterogeneity

Q: What if environmental conditions are spatially heterogeneous?



A: Spatial heterogeneity adds more variability  $\Rightarrow$  Access to free space score cannot make accurate predictions.

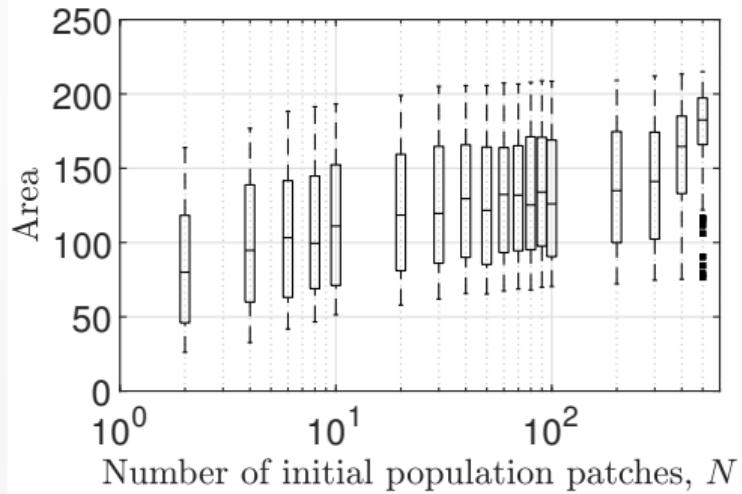
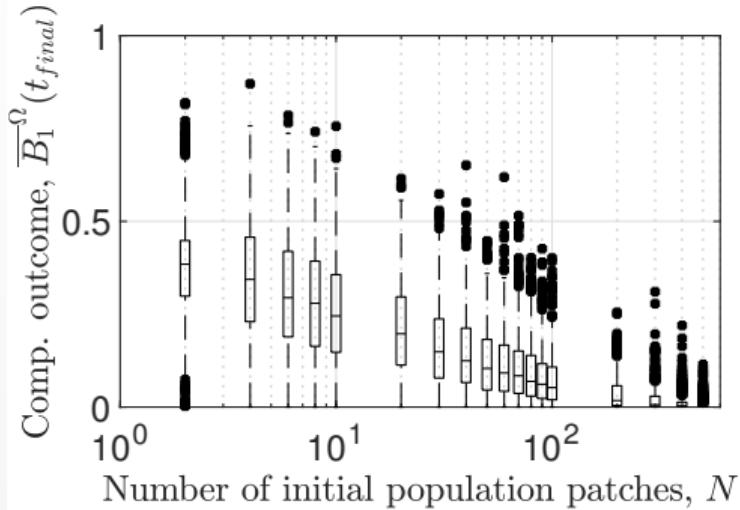
## Impact of spatial heterogeneity

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Q: Which source of variability (low founder density or spatial heterogeneous environmental conditions) dominates?

# Impact of spatial heterogeneity

Q: Which source of variability (low founder density or spatial heterogeneous environmental conditions) dominates?



A: Low founder density determines variability in competitive outcome but spatial heterogeneities determine variability in footprint.

## Predictions of competitive outcome in heterogeneous landscapes

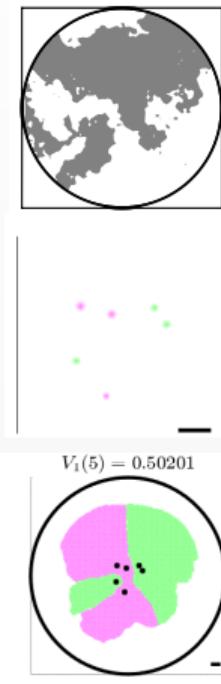
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Q: Can we still make predictions of competitive outcome?

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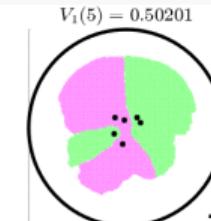
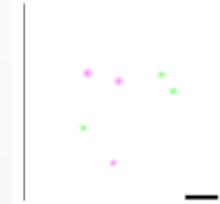
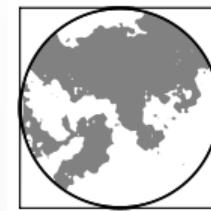
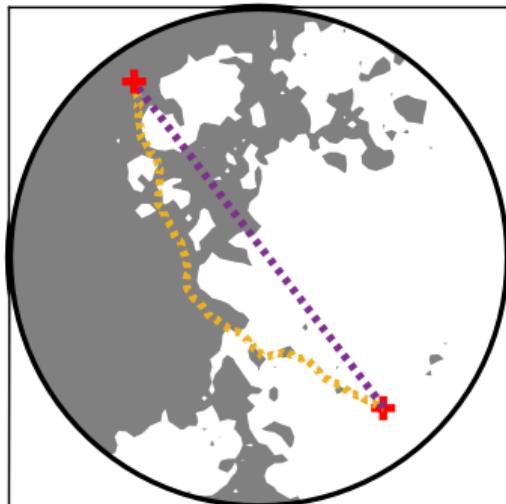
A: Yes, using Voronoi tessellations based on an appropriate metric.



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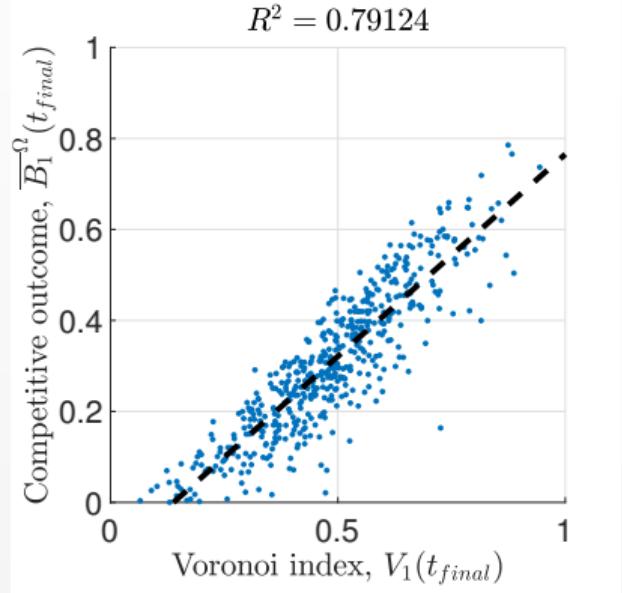
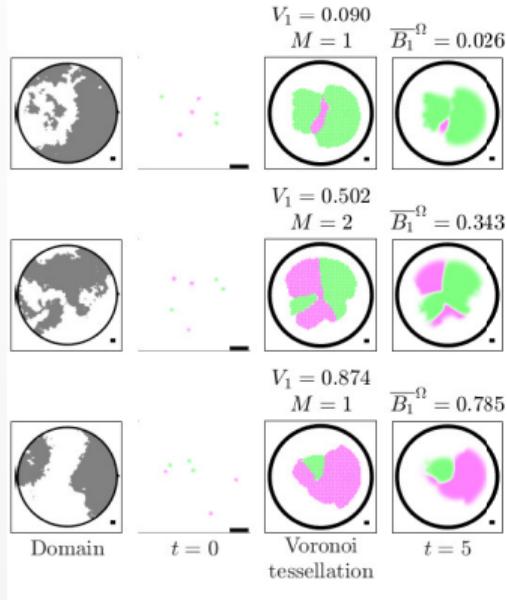
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# Predictions of competitive outcome in heterogeneous landscapes

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# Conclusions

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- Large variability in competitive outcome occurs for biofilms inoculated at low founder density, induced by the random positions of founder cells within the inoculum.
- Large variability in biofilm footprint occurs in spatially heterogeneous environments.
- Competitive outcome can be predicted based on founder cell locations and information on the spatial environment.
- Predictions hold true even if kin discrimination occurs ⇒ “Race for space” is more important than antagonistic actions at low founder densities.
- Impact on applications (e.g. use of *B. subtilis* as biofertilizer): Competitive success across all founder densities can only be guaranteed if a strain spreads fast and kills efficiently.

# Acknowledgements

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## Collaborators:

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- Graeme Ball (Univ. of Dundee)
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- Sofia Arnaouteli
- Natalie Bamford
- Alistair Bonsall
- Joana Moreira Carneiro
- Thibault Rosazza
- David Stevenson
- Tetyana Sukhodub

# References

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Slides are available on my website.

<http://lukaseigentler.github.io>

- [1] Eigentler, L., Davidson, F. A. and Stanley-Wall, N. R.: 'Mechanisms driving spatial distribution of residents in colony biofilms: an interdisciplinary perspective'. (Submitted).
- [2] Eigentler, L., Kalamara, M., Ball, G., MacPhee, C. E., Stanley-Wall, N. R. and Davidson, F. A.: 'Founder cell configuration drives competitive outcome within colony biofilms'. *ISME J* 16.6 (2022), pp. 1512–1522.
- [3] Eigentler, L., Stanley-Wall, N. R. and Davidson, F. A.: 'A theoretical framework for multi-species range expansion in spatially heterogeneous landscapes'. *Oikos* 2022.8 (2022), e09077.

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## Additional slides

## Predictions of competitive outcome in heterogeneous landscapes

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Q: Can we still make predictions for competitive outcome?

## Predictions of competitive outcome in heterogeneous landscapes

Q: Can we still make predictions for competitive outcome?

A: Yes, using **Voronoi tessellations based on an appropriate metric.**

Let  $\mathcal{P}(x, y) := \{P = p([0, 1]) \subset \Omega, \text{ where } p : [0, 1] \rightarrow \Omega : p \in C^1 \text{ a.e., } p(0) = x, p(1) = y\}$  be the set of all paths from  $x$  to  $y$ . For a given path  $P \in \mathcal{P}(x, y)$ , the time taken to move along the path is given by

$$I(P) := \int_P \frac{1}{c(x)} ds = \int_0^1 \frac{1}{c(p(\tau))} \|p'(\tau)\| d\tau,$$

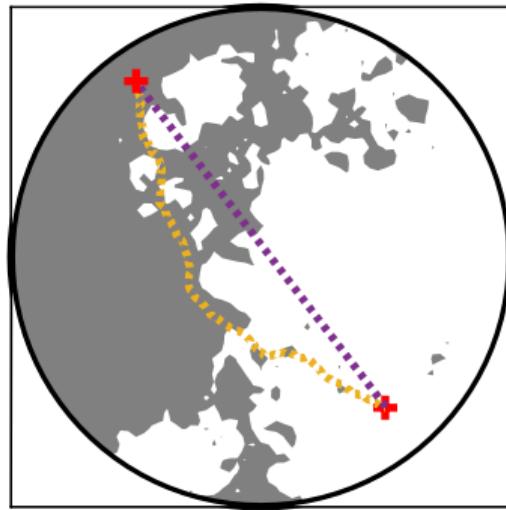
where  $0 \leq c(x) < \infty$  represents the propagation speed along the path  $P$ . We define the *front propagation metric* from  $x$  to  $y$  as

$$t_{FP}(x, y) := \inf_{P \in \mathcal{P}(x, y)} I(P).$$

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Voronoi tessellation of whole domain:

$$\Delta_{B_i}^\Omega := \left\{ x \in \Omega : \min_{x_i \in B_i} t_{FP}(x, x_i) \leq \min_{x_j \in B_j} t_{FP}(x, x_j), i \neq j \right\},$$

where  $B_i := \{x \in \{x_1, \dots, x_N\} : B_i(x, 0) > 0\}$ ,  $i = 1, 2$ .

Restrict to area expected to be occupied by time  $t$ :

$$\Delta_{B_i}(t) := \left\{ x \in \Delta_{B_i}^\Omega : \min_{y \in B_i} t_{FP}(x, y) \leq t \right\}, \quad i = 1, 2.$$

*Voronoi index:*

$$V_i(t) := \frac{\text{Area}(\Delta_{B_i}(t))}{\text{Area}(\Delta_{B_1}(t)) + \text{Area}(\Delta_{B_2}(t))}, \quad i = 1, 2,$$

