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## Slide of the Seminar

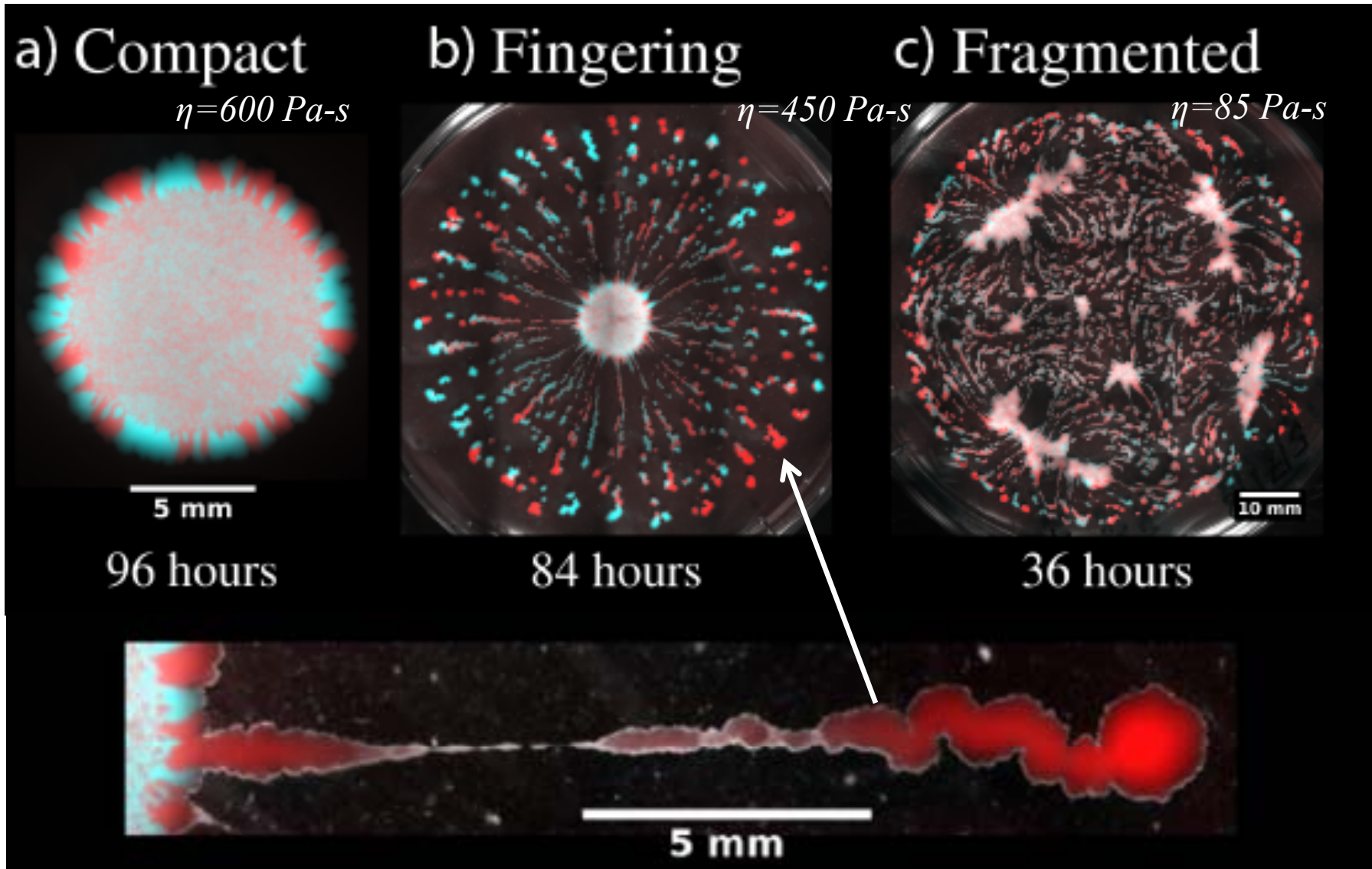
# **On Growth and Form of Microorganisms on Liquid Substrates**

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***ERC Advanced Grant (N. 339032) “NewTURB”  
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*Microbial range expansions of close-packed reproducing yeast cells on liquid substrates*



# Life probably evolved first in a *liquid* environment

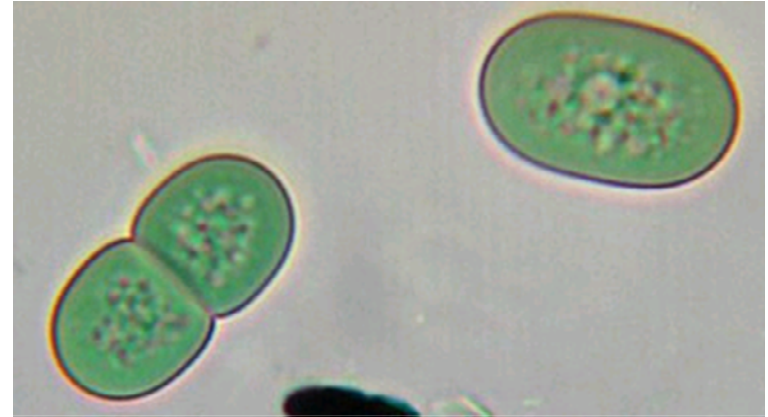
- *~2-3 billion years ago, like today, water covered most of the earth*

- *Fossilized, oxygen-producing cyanobacteria have been dated at ~2 billion years ago.*

- *Oxygenic cyanobacteria transformed the atmosphere via photosynthesis*

- *Their spatial growth and evolutionary competition took place in liquid environments at both high and low Reynolds numbers*

- *These photosynthetic organisms control their height to resist down welling currents and stay close to the ocean or lake surface.*



Cyanobacterium *Synechococcus*

[www.dr-ralf-wagner.de/Blaualggen-englisch.htm](http://www.dr-ralf-wagner.de/Blaualggen-englisch.htm)



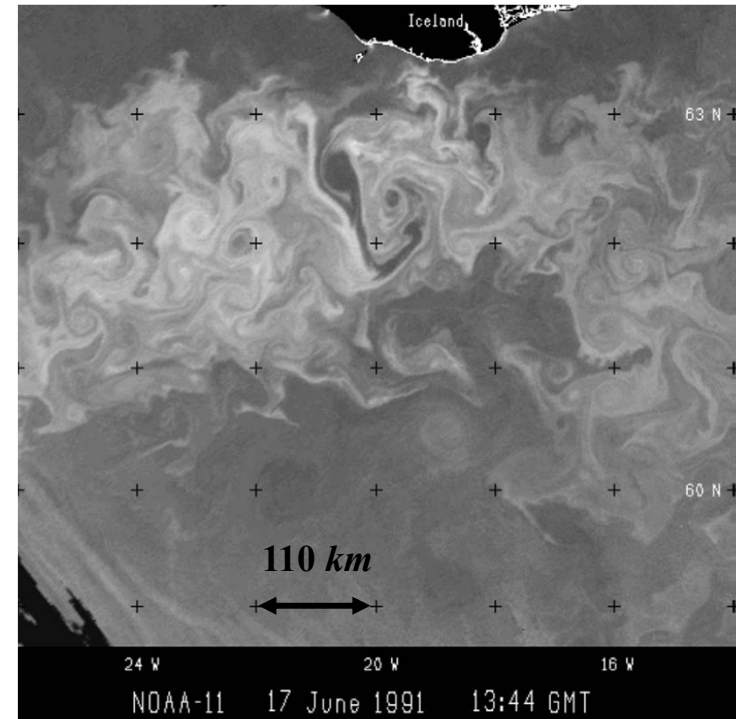
Bloom of cyanobacteria  
in Lake Atitlán, Guatemala  
NASA Earth observatory

# Striated plankton populations in oceanic flows

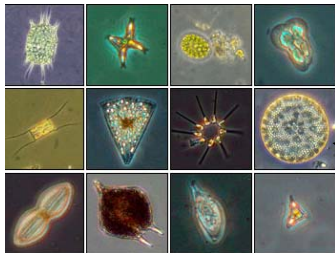
Phytoplankton blooms at high Reynolds number in the Norwegian Sea and near Iceland



<http://visibleearth.nasa.gov/cgi-bin/viewrecord?5278>  
.see also, Tel. et al. Phys. Rep. **413**, 91 (2005).



A. P. Martin, Prog. Oceanography **57**, 125 (2003)



mixing layer  $\approx 25-100$  m.

Phytoplankton  
(see also zooplankton  
& bacterioplankton)

[http://earthobservatory.nasa.gov/Experiments/ICE/Channel\\_Islands/](http://earthobservatory.nasa.gov/Experiments/ICE/Channel_Islands/)

$$Re = LU / \nu = 10^8 - 10^9$$

Large eddy turnover time  $\approx 50$  days

Small eddy turnover time  $\approx 5$  minutes

Plankton doubling time  $\approx 12-24$  hours

# Compressible advection of microorganism density $c(x,t)$

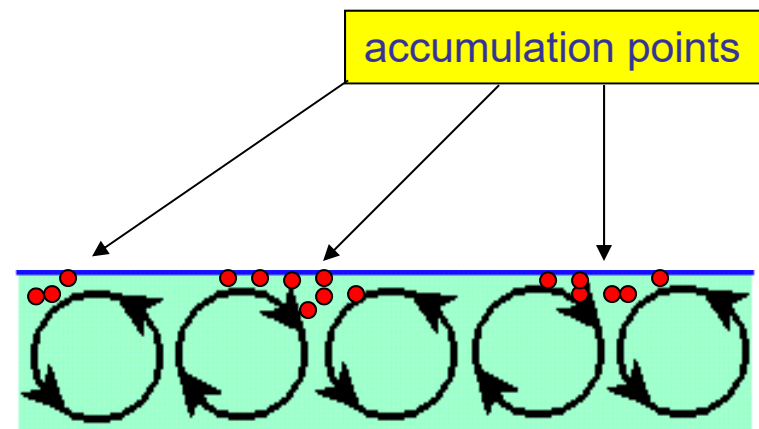
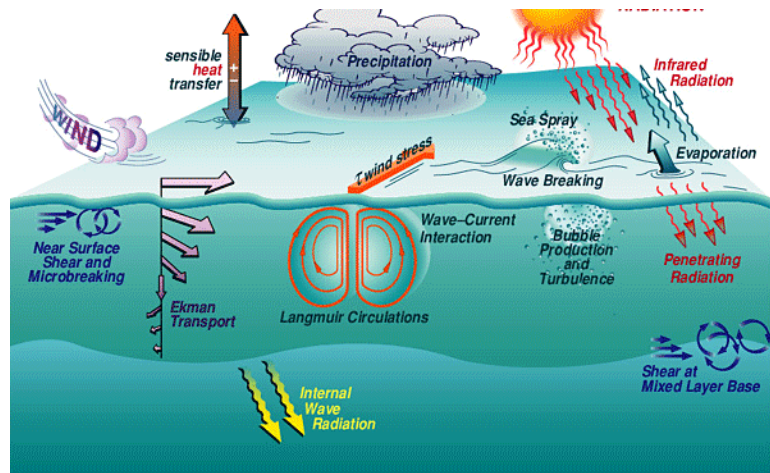
$$\frac{\partial}{\partial t} c(\vec{x}, t) + \nabla \cdot [\vec{u}(\vec{x}, t) c(\vec{x}, t)] = D \nabla^2 c(\vec{x}, t) + \mu c(\vec{x}, t) [1 - c(\vec{x}, t)]$$

$$\vec{\nabla} \cdot \vec{u}(\vec{x}, t) \neq 0$$

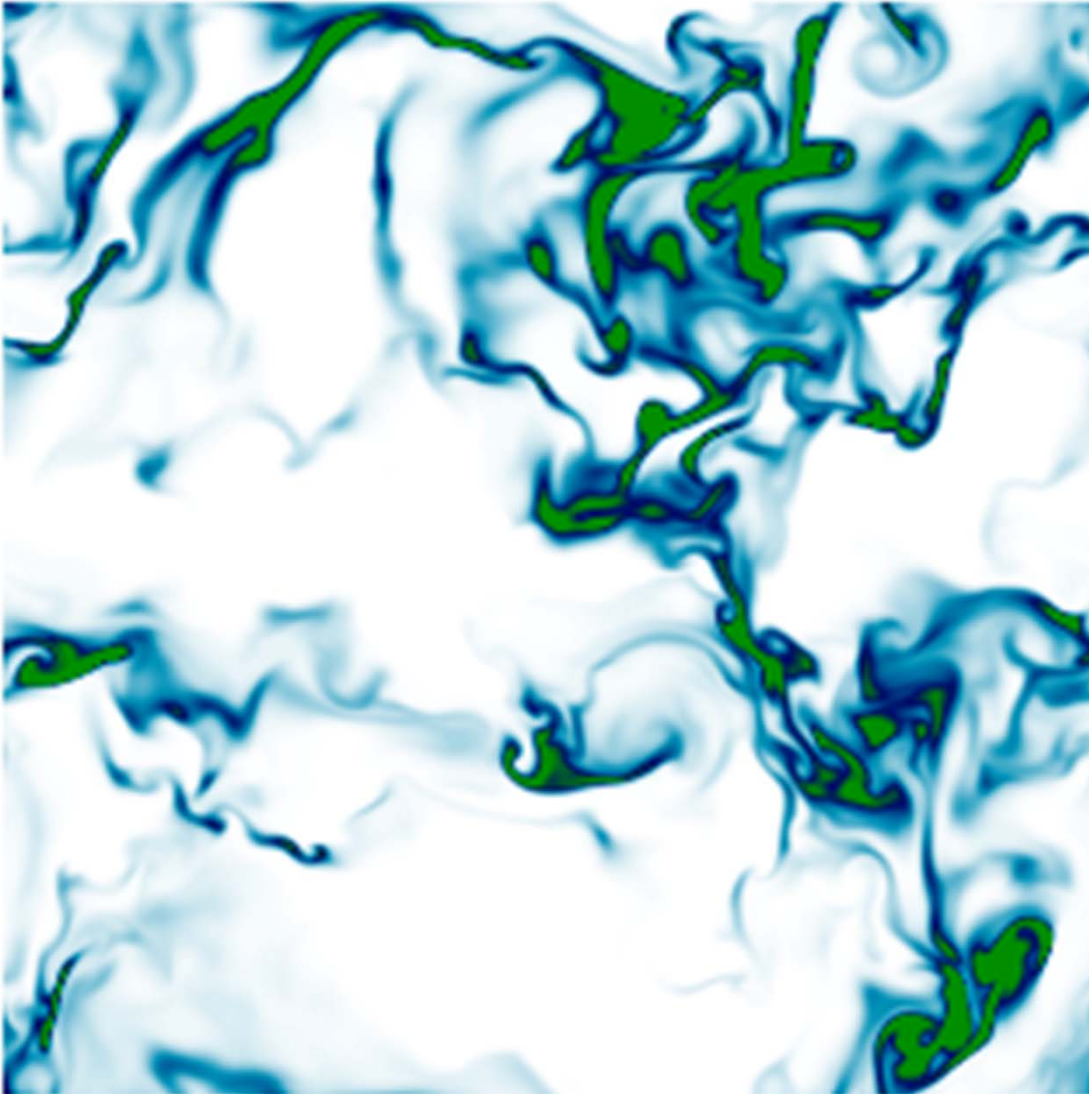
$u(\vec{x}, t)$  is an effective  $2d$  compressible turbulent velocity field....

$\mu$  is the growth rate...

*Advection by an effectively compressible two dimensional velocity field results for organisms that actively control their buoyancy to stay close to the ocean surface.*



# Buoyant population dynamics in Silico (Perlekar, Toschi, Benzi, drn)



$$\frac{\partial \vec{u}}{\partial t} + \vec{u} \cdot \vec{\nabla} \vec{u} = -\frac{1}{\rho} \vec{\nabla} p + \nu \nabla^2 \vec{u} + \vec{f}$$

project onto a 2d plane  $\rightarrow \vec{\nabla} \cdot \vec{u}_{2d} \neq 0$

$$\frac{\partial c}{\partial t} + \nabla \cdot (\vec{u}_{2d} c) = D \nabla^2 c + \mu c(1 - c)$$

Reynolds number

$$Re = \frac{u_{\text{rms}} L}{\nu}$$

Schmidt number

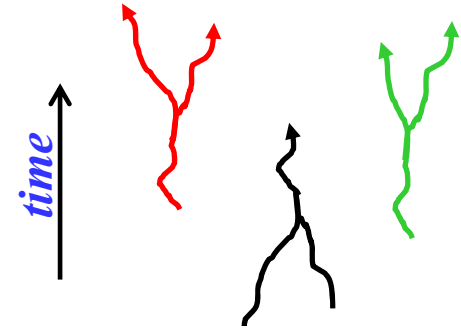
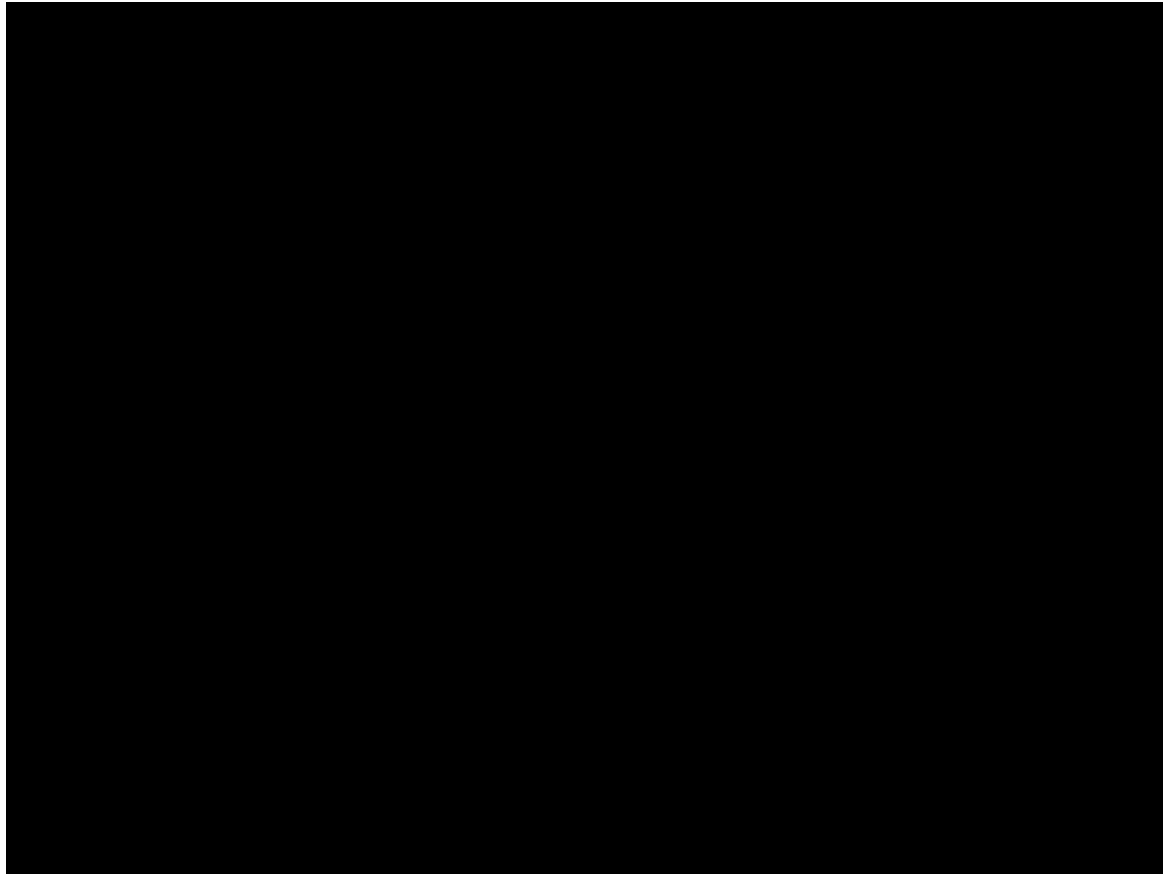
$$Sc = \frac{\nu}{D}$$

Doubling time/eddy turnover time

$$\tau_2 / \tau_{\text{eddy}} \sim 1 / (\mu \tau_{\text{eddy}})$$

# Compressible population genetics with two interacting species

Compressible turbulent flow ( $\text{Re} \sim 10^5$ )  $\kappa = \langle (\vec{\nabla} \cdot \vec{u})^2 \rangle / \langle (\partial_i u_j)^2 \rangle = 0.17$



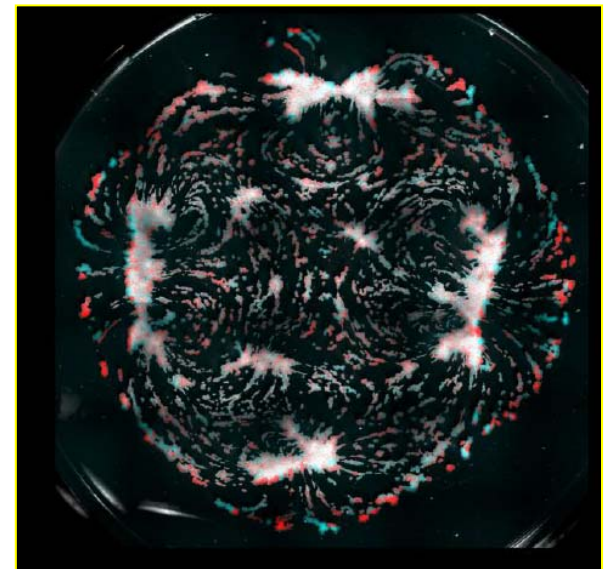
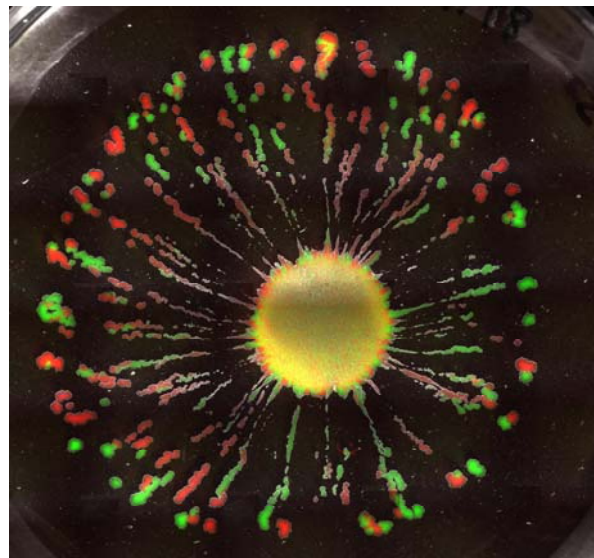
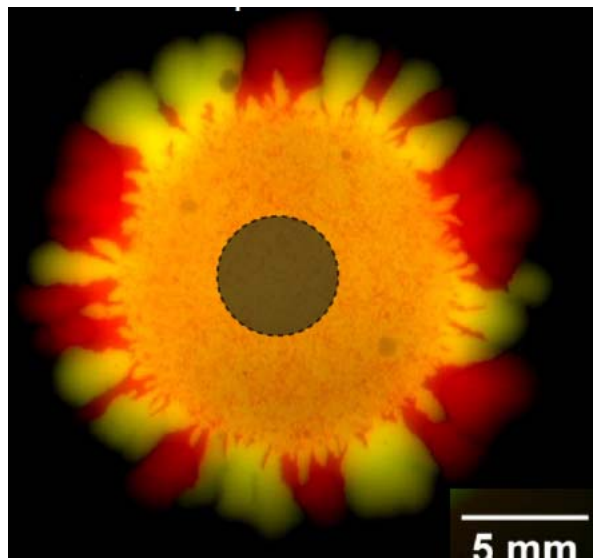
*Agent-based simulation:  
“Survival of the luckiest”*

*Wanted: simple repeatable  
experiments that explore  
how fluid flows affect spatial  
population genetics....*

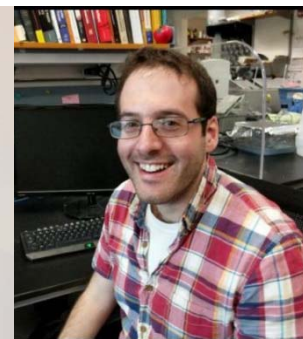
- *High Reynolds numbers might be hard to achieve in the laboratory, but low Reynolds numbers can also be biologically relevant*
- *Can we impose a flow such that the doubling time  $\tau_2 \ll \tau_{eddy}$ , where  $\tau_{eddy}$  is a eddy turnover time?*

# On Growth and Form of Microorganisms on *Liquid* Substrates

“Microbes on the surface of a highly viscous liquid generate buoyant flows that alter colony morphology and evolutionary dynamics”

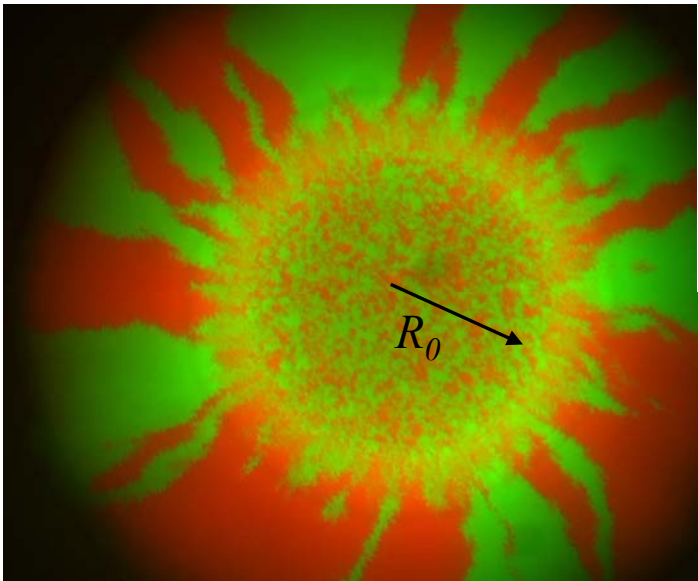
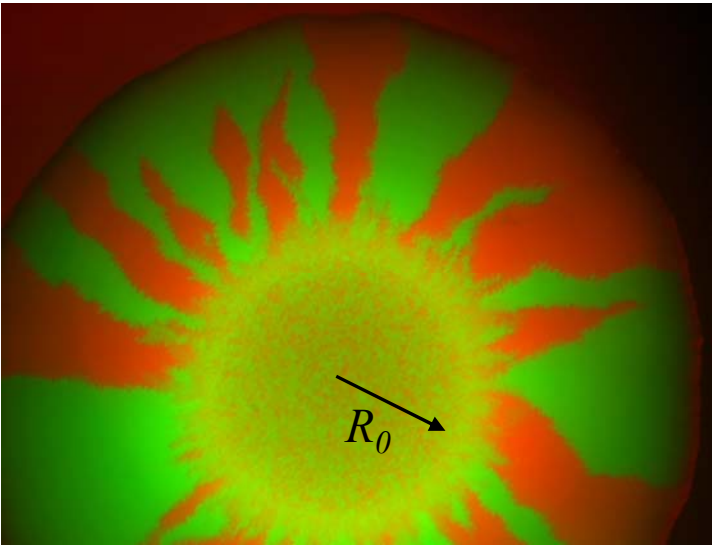
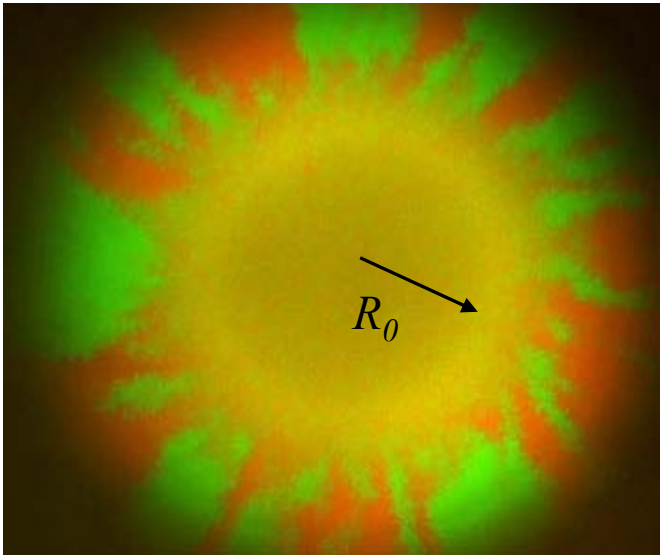
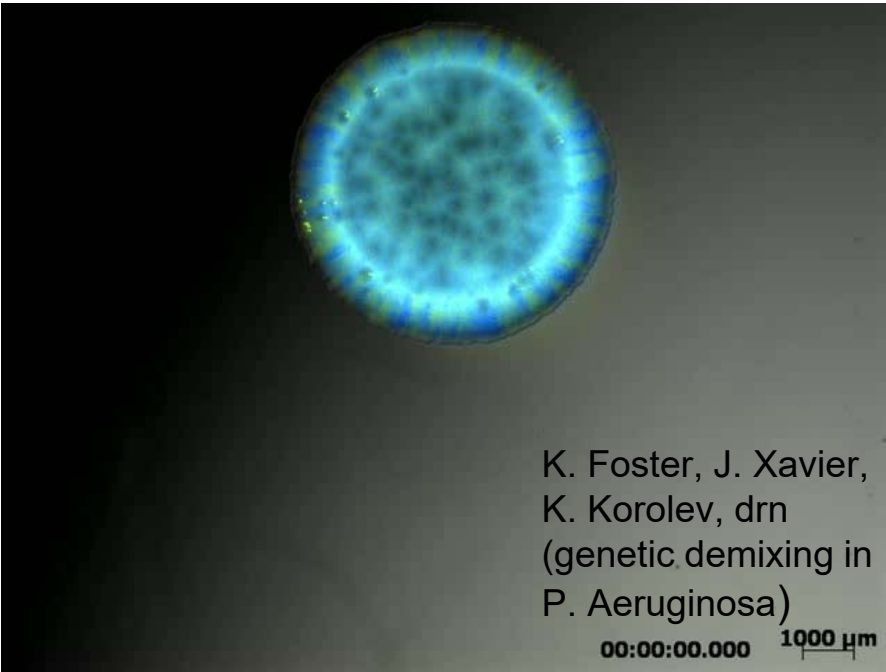


Severine Atis  
Bryan Weinstein  
Andrew Murray



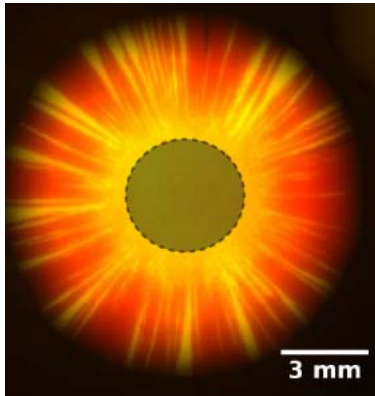


# Experiments on hard agar plates: *P. aeruginosa* & *E. coli*



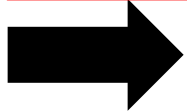
*Microorganisms grown on liquid but highly viscous substrates create their own flows (without pumps and syringes!)*

Hard Agar

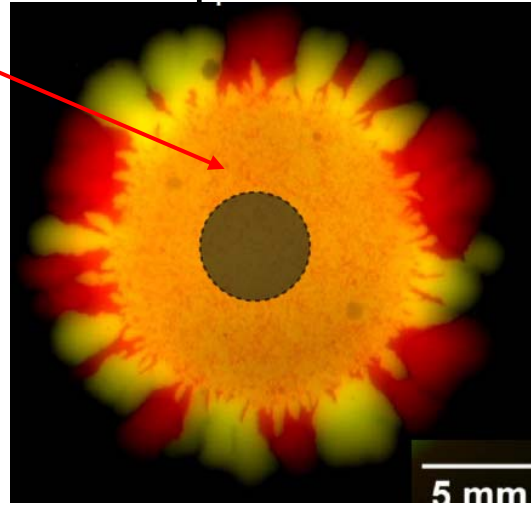


*Yeast on a 1% hard agar YPD plate (viscosity  $\eta = \infty$ )*

*Epoch of genetic demixing stretched out....*



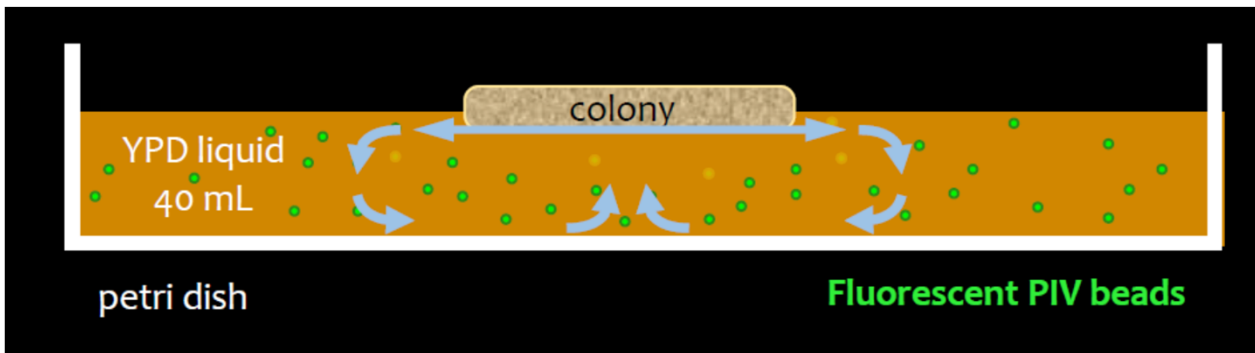
Liquid Media



*Yeast on a liquid but highly viscous YPD media with 3% cellulose ( $\eta \approx 600 \text{ Pa-s}$ )*

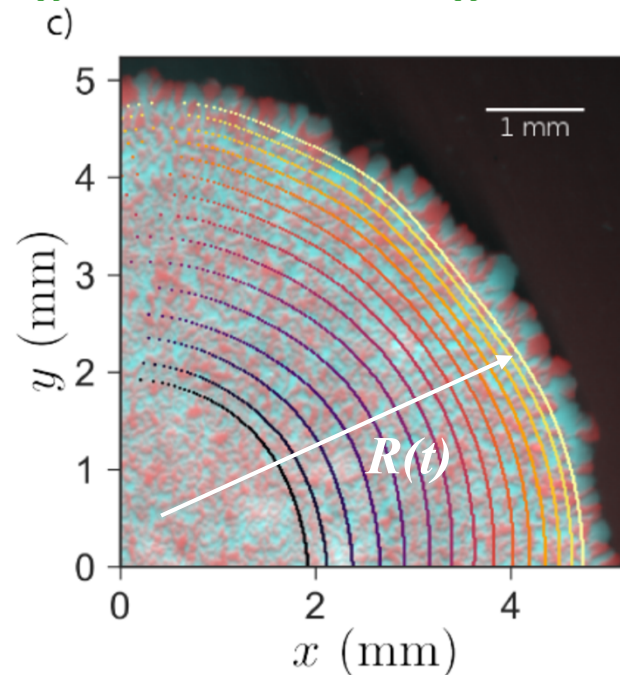
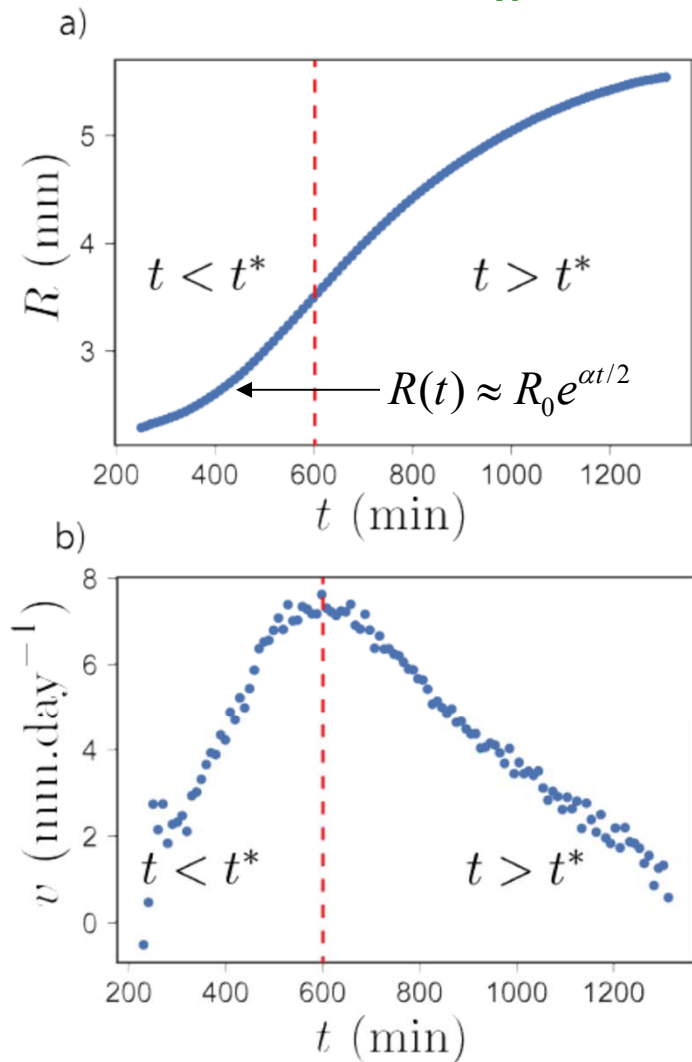
Cellulose % (w/v)	Viscosity (Pa·s)
1.8	$22 \pm 3$
2.0	$51 \pm 6$
2.2	$81 \pm 9$
2.4	$120 \pm 10$
2.6	$340 \pm 50$

*(the viscosity of water is  $\eta \approx 10^{-3} \text{ Pa-s}$ ; our viscosities are  $10^4 - 10^5$  times larger)*



*The colony itself generates flows that dilate the colony radially!*

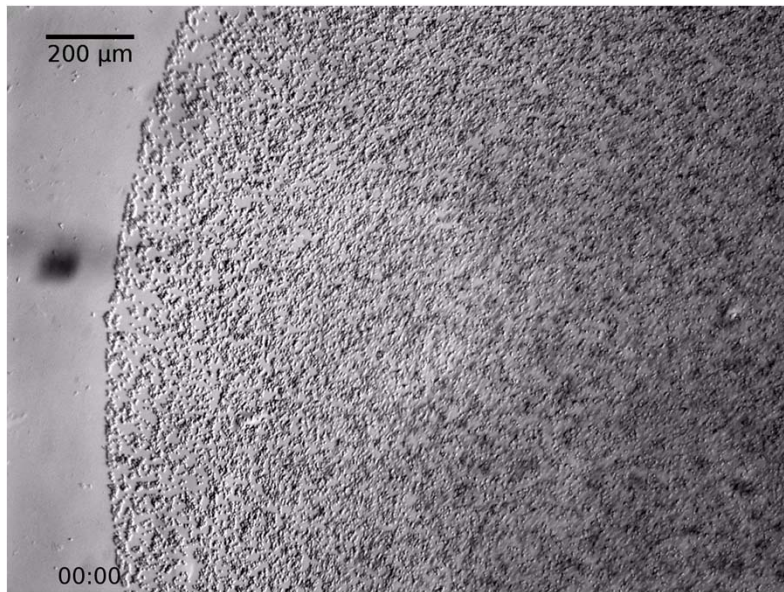
*We find initial exponential growth for  $t < t^*$ , followed by a gradually slowing down & genetic demixing at the frontier*



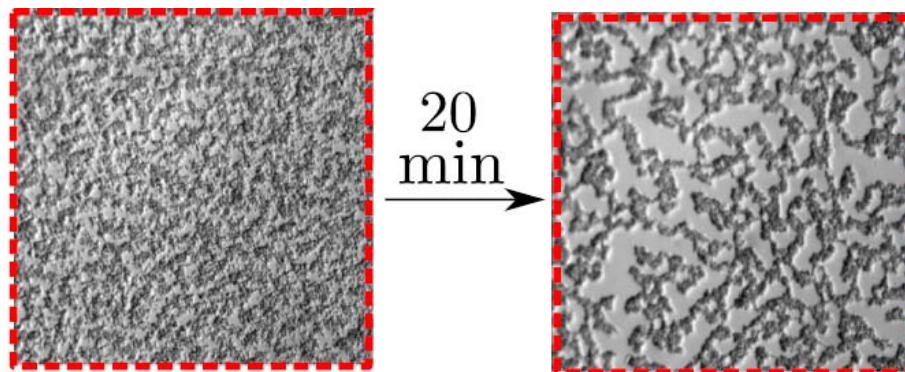
- a) *Radially averaged yeast colony radius  $R(t)$  during the first 24h of growth on a high viscosity liquid substrate with  $\eta = 600$  Pa-sec.*
- b) *The colony front velocity  $v(t)$  extracted from  $R(t)$ , exhibiting: (1) an approximately exponential phase for  $t < t^*$  and (2) a slowly decaying velocity over time for  $t > t^*$ .*
- c) *Consecutive front spatial positions at 40 min intervals during the first 24h of growth.*

*As the time since inoculation elapses, microorganisms on liquid substrates can behave like gases, liquids or solids....*

*Example 1: Early time behavior exhibits gas-liquid phase separation*

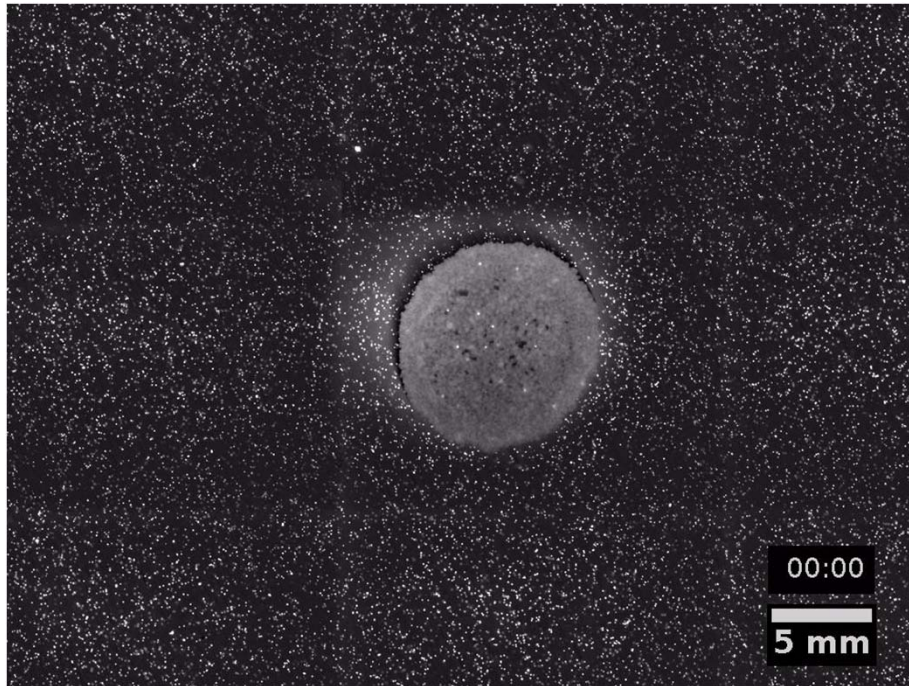


*D. Vella and L. Mahadevan, American Journal of Physics 73.9 (2005): 817-825.*

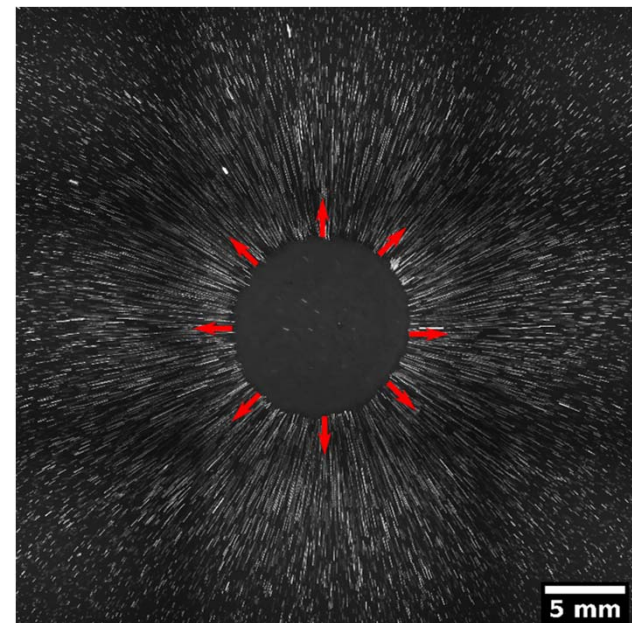


*Coarsening or “spinodal decomposition”....*

24-48 hours,  $\eta \approx 600 \text{ Pa}\cdot\text{S}$



*Motion of fluorescent beads around a mature colony reveals that fluid motion is generated beneath the growing colony*

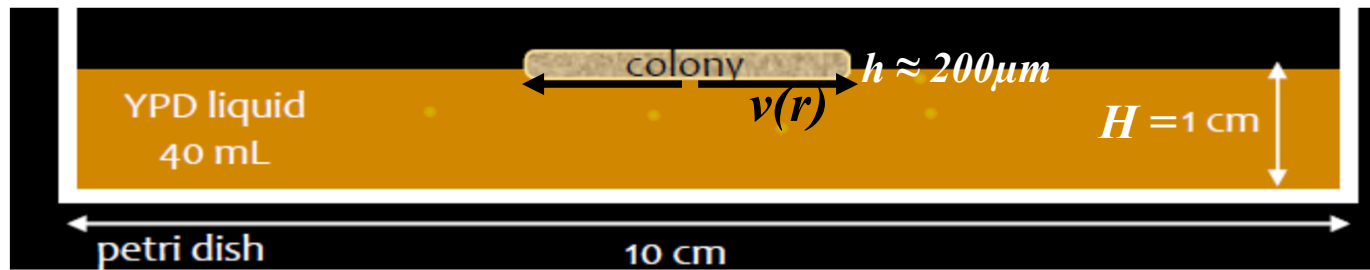


*One early time mechanism for radial motion is outward pushing when all cells at the interface are actively dividing....*

*Deformations of features inside colony in a liquid-like regime consistent with a dilational flow ( $\eta = 600 \text{ Pa}\cdot\text{sec}$ )*



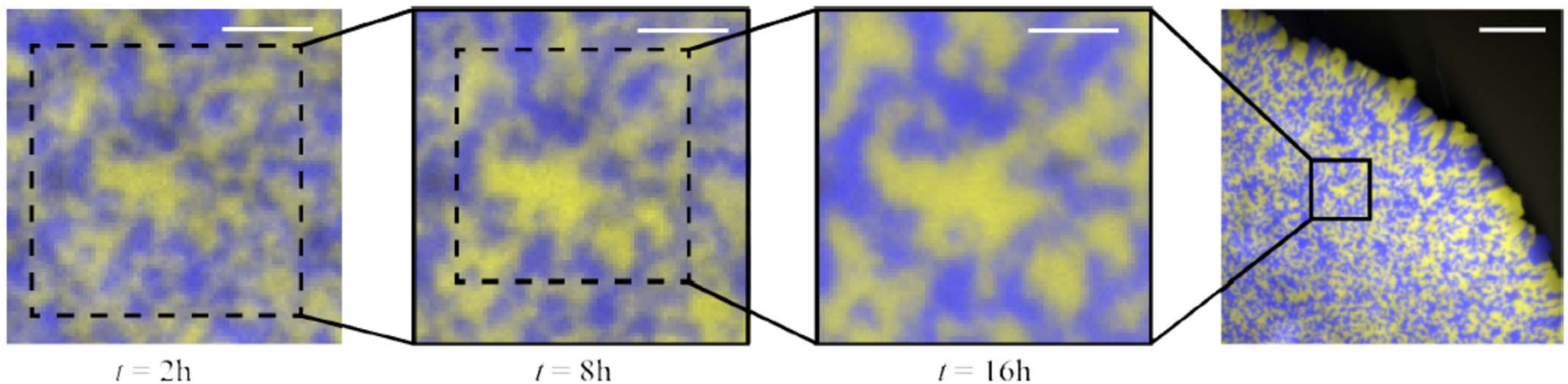
# Colony features dilate as if inscribed on an inflating balloon....



Simple model of 2d colony dynamics:  $\frac{\partial \rho_{2d}}{\partial t} + \vec{\nabla} \cdot (\rho_{2d} \vec{v}_{2d}) = \alpha_1 \rho_{2d}$ ,  $\rho_{2d}$  = cell density

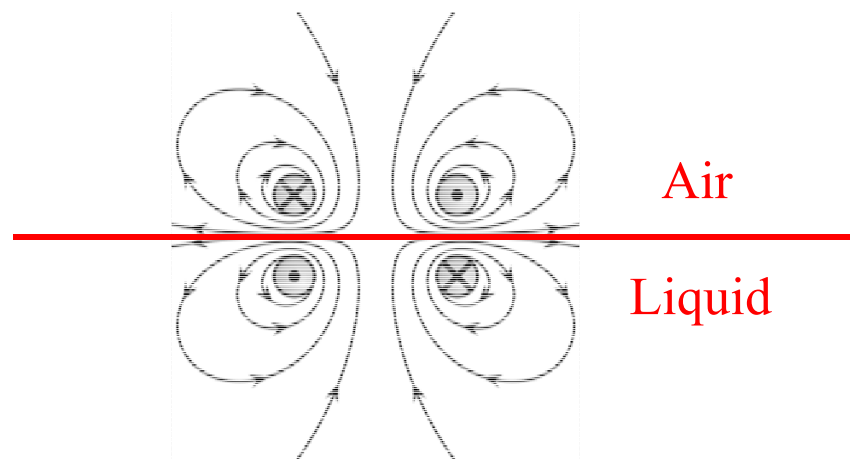
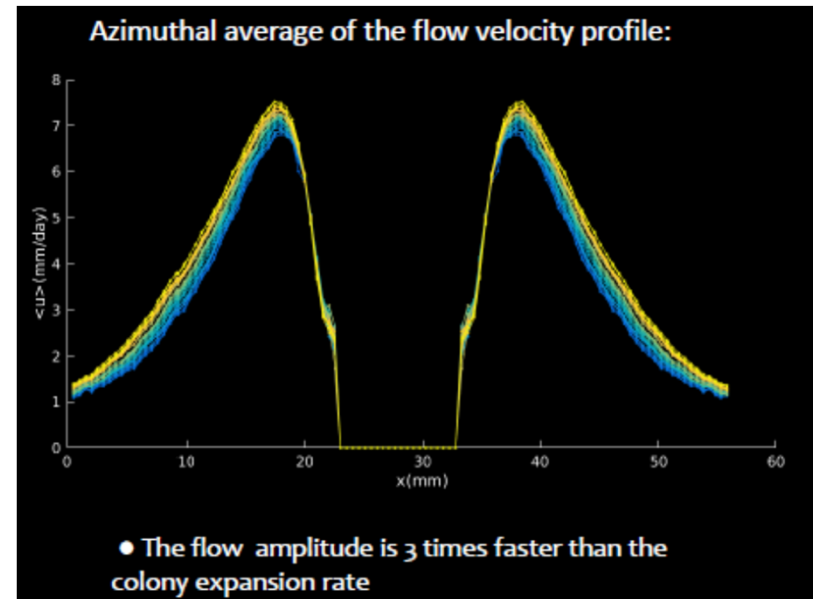
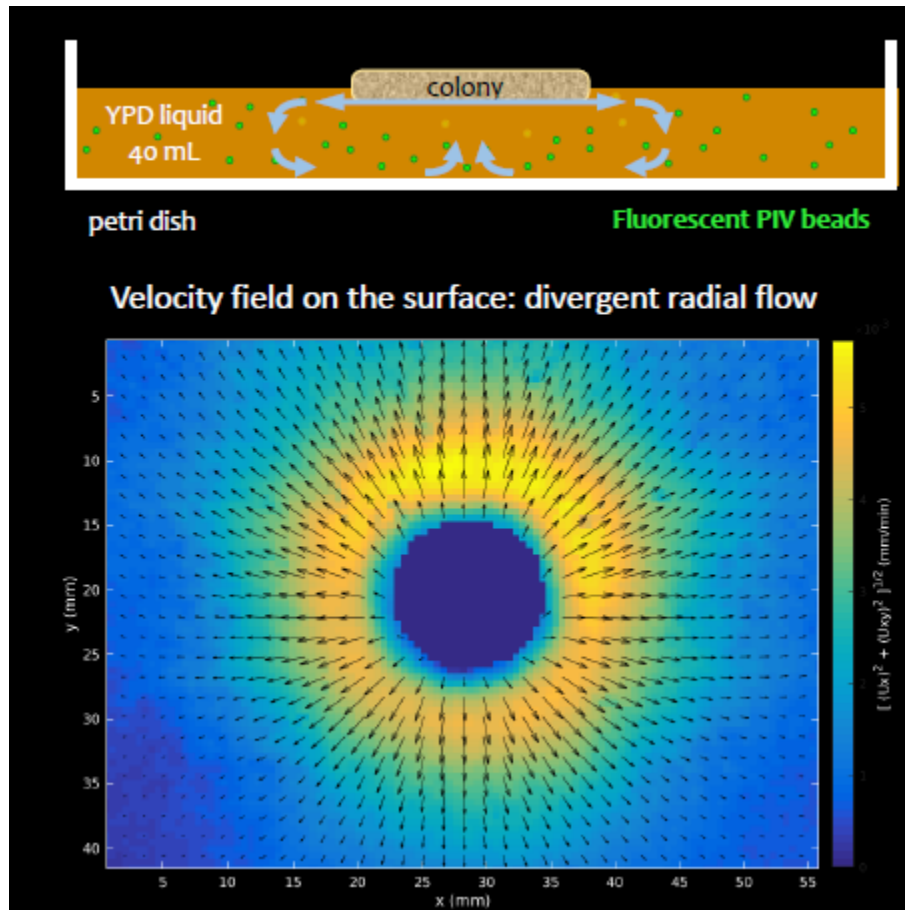
$\alpha_1$  = growth rate  $\rightarrow \vec{\nabla} \cdot \vec{v}_{2d}(r) = \alpha_1$ ; assume overdamped liquid-like colony dynamics:

$$0 \approx -\vec{\nabla} p_{2d} - \gamma \vec{v}(\vec{r}); \quad \gamma = \eta_s / hH; \quad \rightarrow \quad \vec{v}_{2d}(\vec{r}) \approx \frac{1}{2} \alpha_1 r \hat{r} \quad \text{dilational velocity field}$$



*The first three images have the same scale bar = 100  $\mu\text{m}$ . The final picture, with scale bar 500  $\mu\text{m}$ , shows the same feature at the much larger colony scale*

*In addition to simple outward pushing due to excluded volume interactions, we find a metabolically-induced vortex ring under the colony, enhancing the radial growth rate*

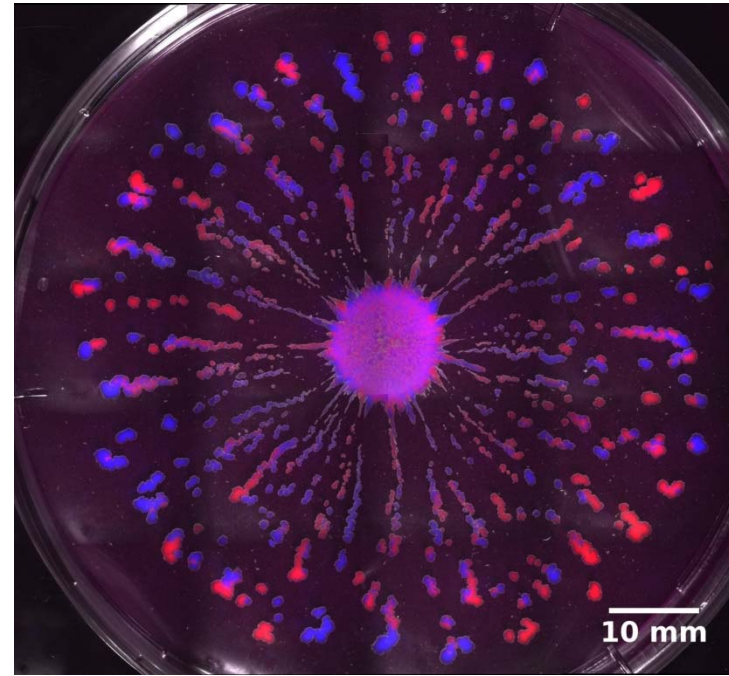


$$\Rightarrow \vec{v}(\vec{r}) \approx \frac{1}{2} \alpha_2 r \hat{r}$$

Like an anti-Helmholtz coil!

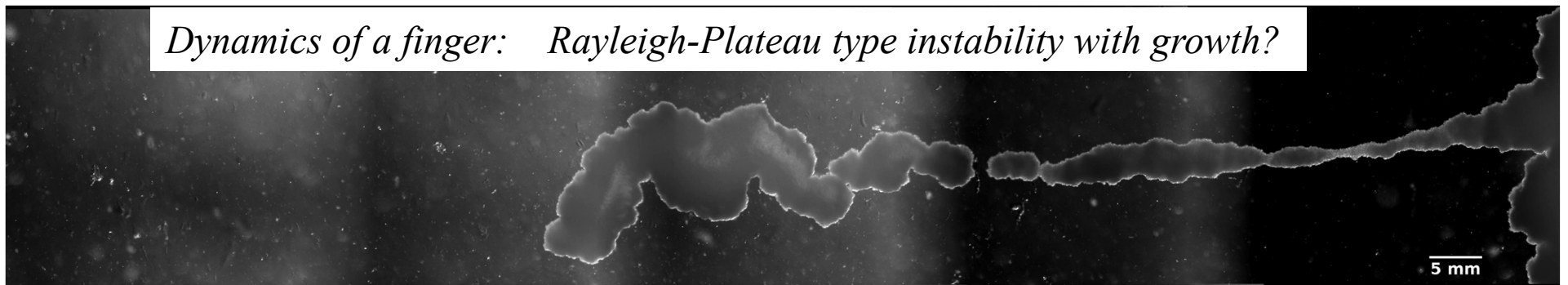


*Liquid-like fingering instabilities*  
(moderate substrate viscosity  $\eta \approx 450 \text{ Pa}\cdot\text{s}$ )

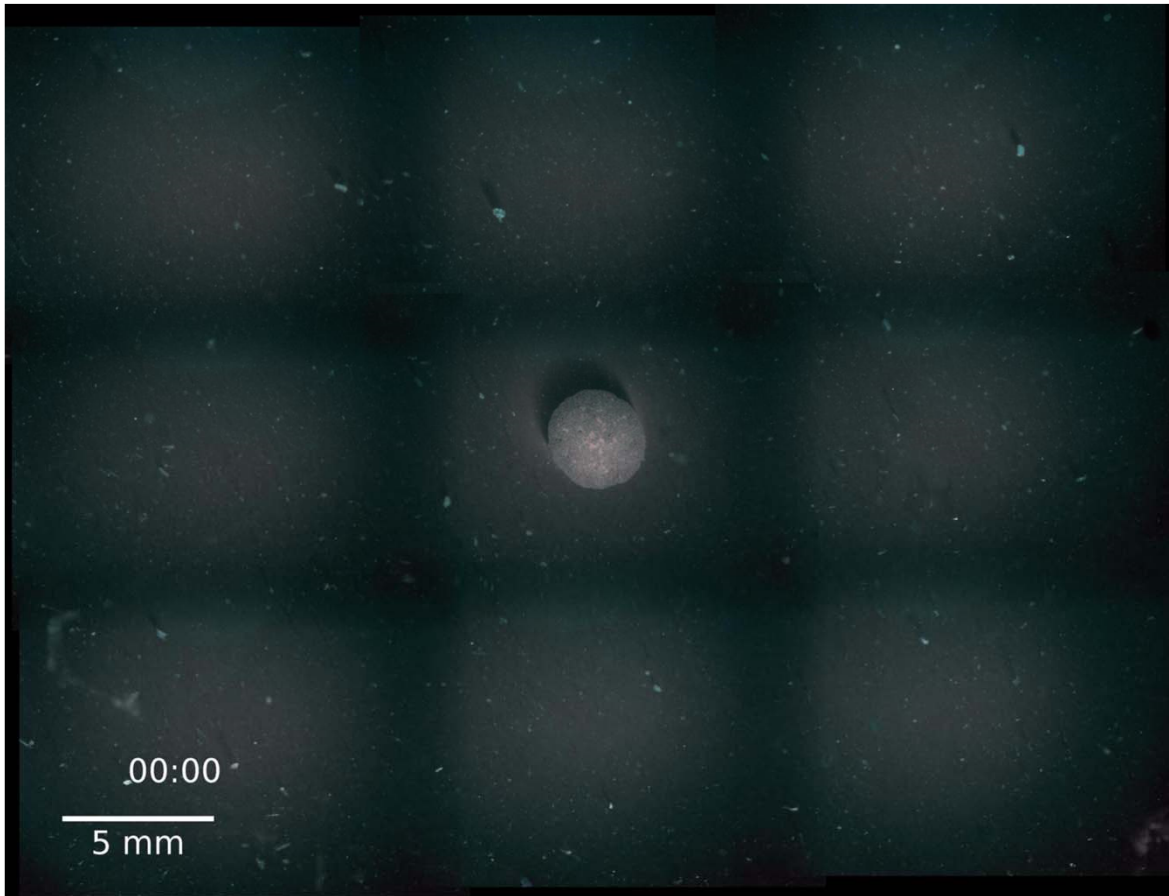


(Happy Bastille Day!)

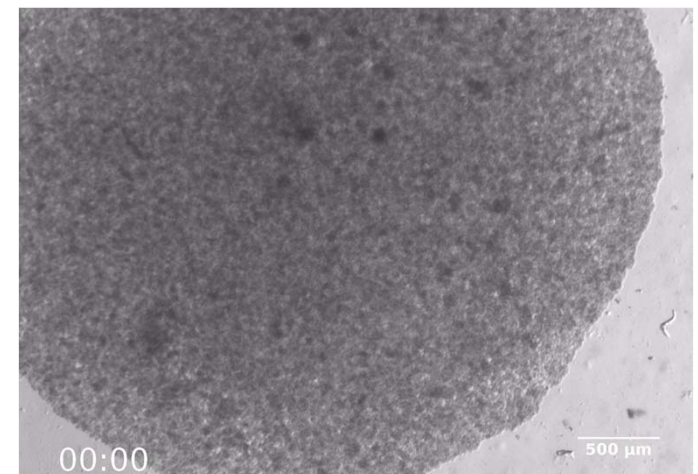
*Dynamics of a finger: Rayleigh-Plateau type instability with growth?*



*Solid-like colony fragmentation*  
(low substrate viscosity  $\eta \approx 85 \text{ Pa}\cdot\text{s}$ )

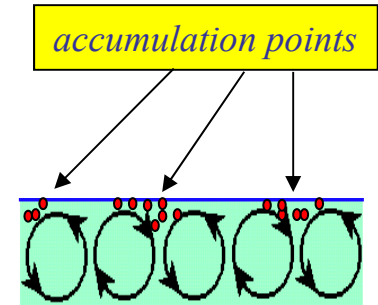
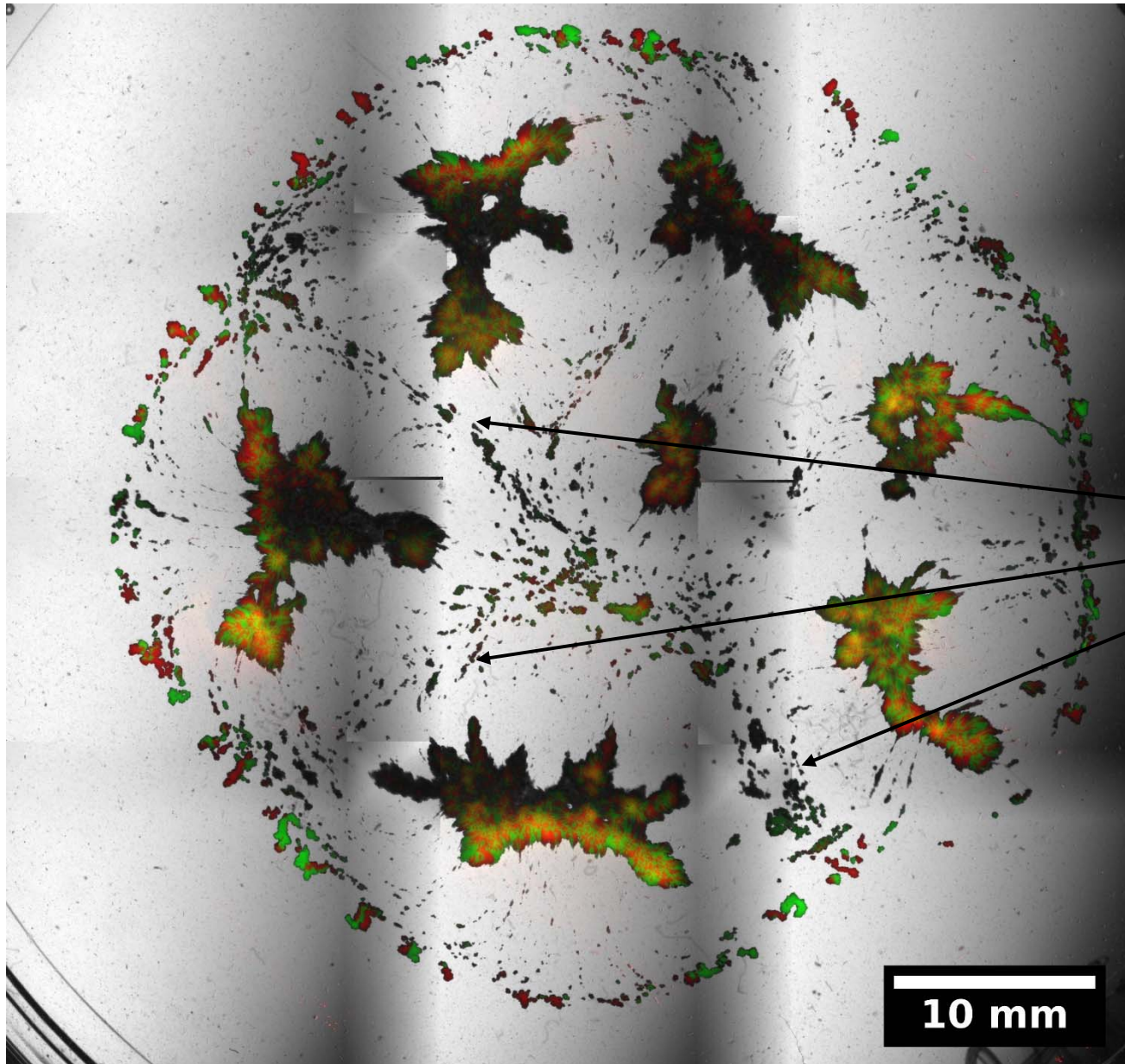


*Zoom in reveals  
necking dynamics....*



*Colony takes over plate in < 1 day!*

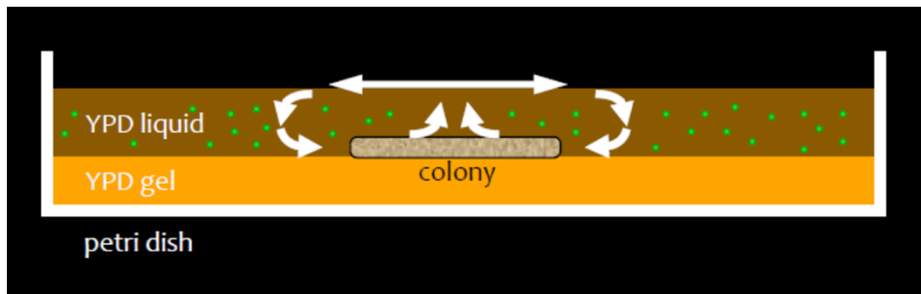
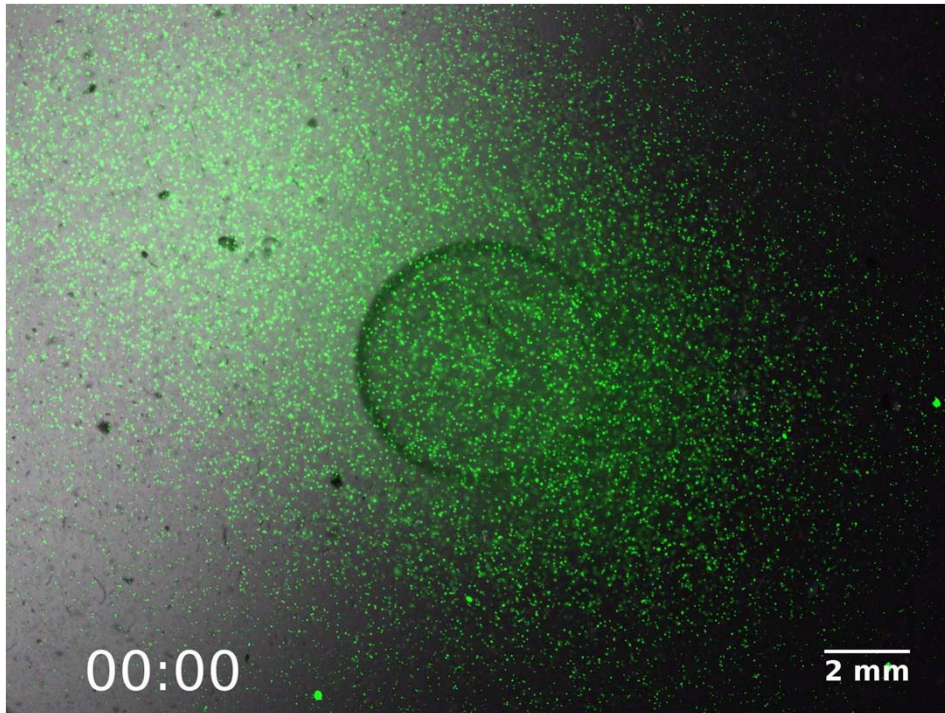
*We expect a submerged vortex ring  
under each colony fragment...*



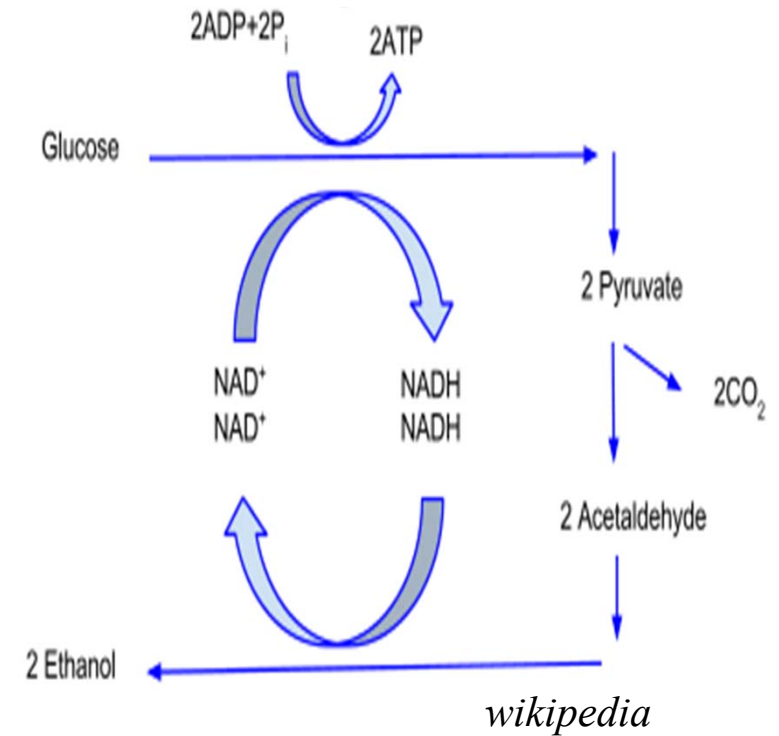
accumulation  
lines for yeast

# Origin of the enhanced flow beneath colonies growing on liquid substrates

## Case I: colony on the bottom of the dish

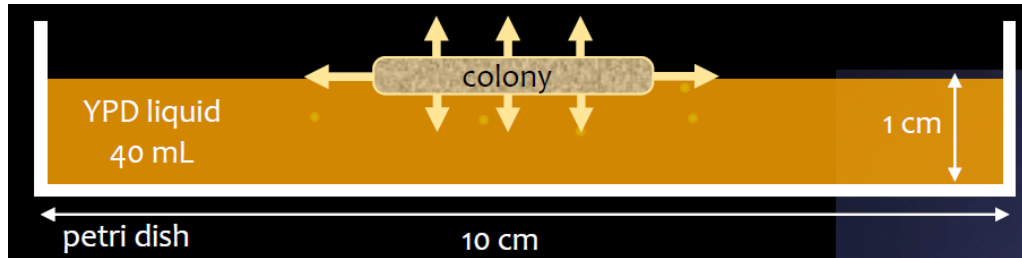


Anaerobic pathway:  
dextrose (~3%)  $\rightarrow$  CO<sub>2</sub> + ethanol



***Yeast colony on bottom, dextrose-metabolism-induced CO<sub>2</sub> bubbles!!***

# Origin of the enhanced flow beneath colonies growing on liquid substrates



## Case II: colony growing at the top of the liquid substrate

### • Fluid mechanics

Boussinesq approximation (valid in the limit of small density difference)

$$\frac{\partial \vec{v}}{\partial t} + \vec{v} \cdot \nabla \vec{v} = -\frac{1}{\rho_0} \nabla p + \nu \nabla^2 \vec{v} + \frac{\rho}{\rho_0} \vec{g}$$

media density:

$$\rho = \rho_0 + \delta\rho = \rho_0(1 + \beta c)$$

$\rho_0$  : fluid density

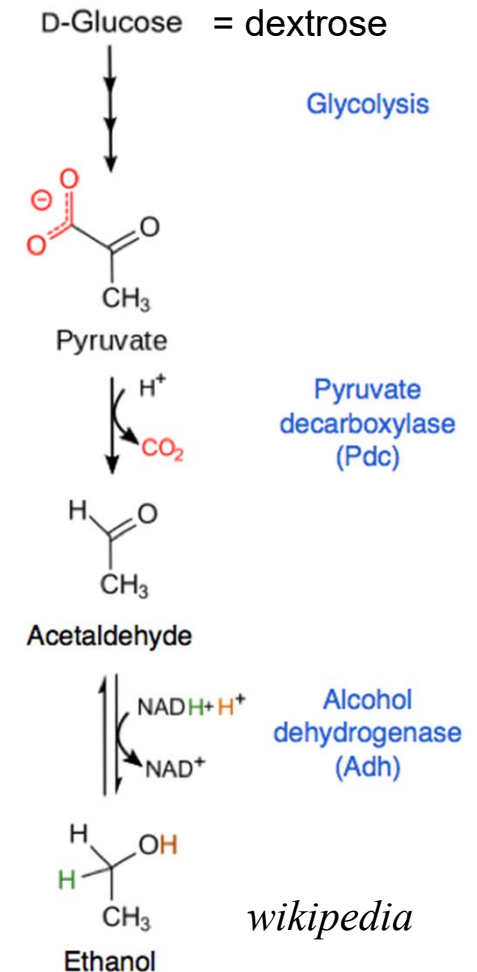
$\nu$  : kinematic viscosity

$g$  : gravity

$p$  : pressure

Diffusion equation for the nutrients field

$$\frac{\partial c}{\partial t} + \nabla \cdot (\vec{v}c) = D \nabla^2 c$$



# Flow simulations

Boundary conditions:

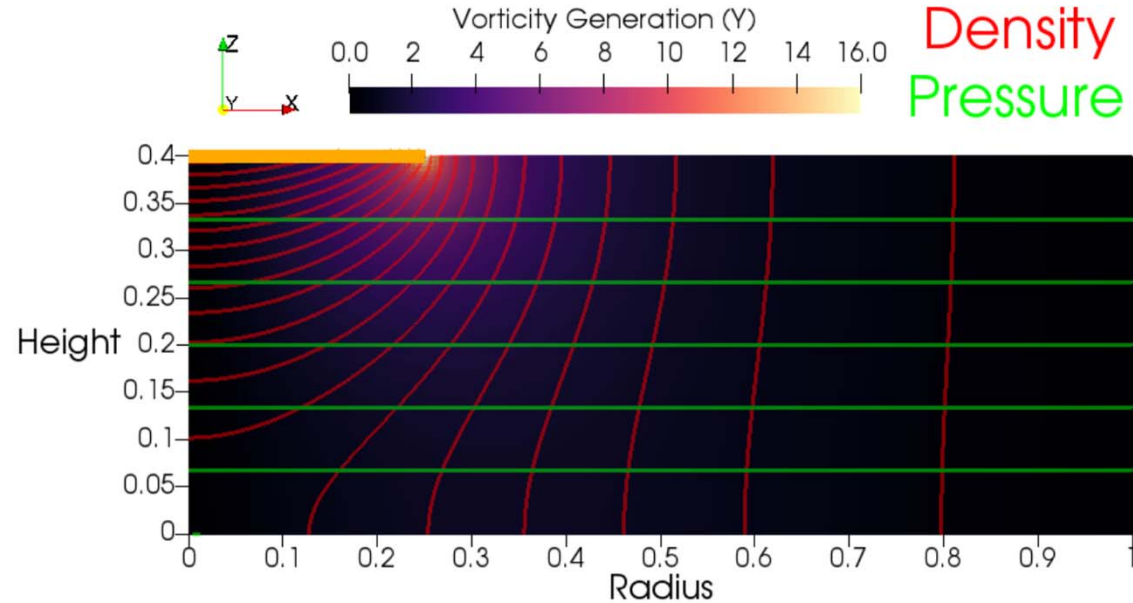
$$j_{\text{out}}^{\rightarrow} = \alpha c \vec{n}$$

$$j_{\text{diff}}^{\rightarrow} = \rho_0 \beta D \nabla c$$

$$j_{\text{out}}^{\rightarrow} = j_{\text{diff}}^{\rightarrow}$$

$$\nabla c \cdot \vec{n} = \frac{\vec{\alpha} c}{\rho_0 \beta D} \cdot \vec{n}$$

Isobars and isoclines in the absence of flow ( $\eta = \infty$ )

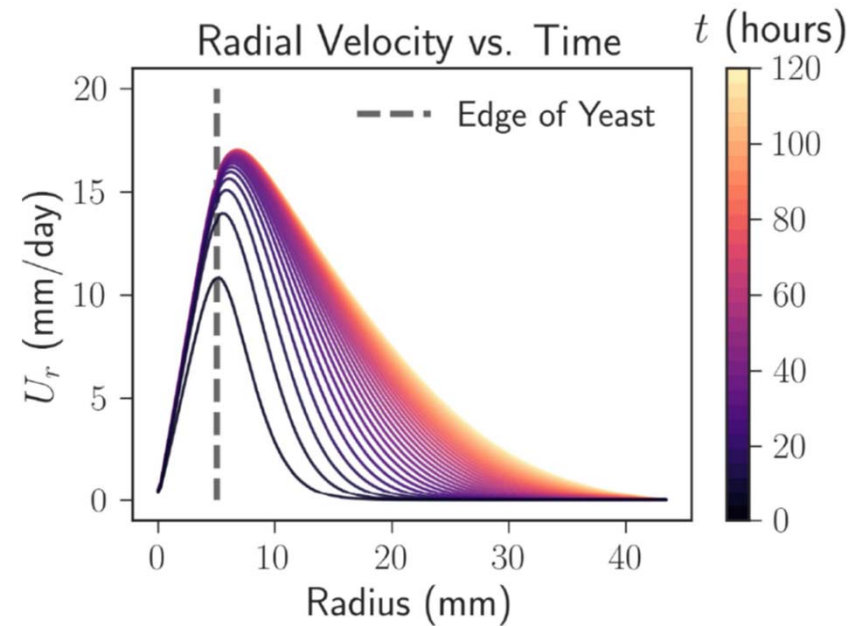
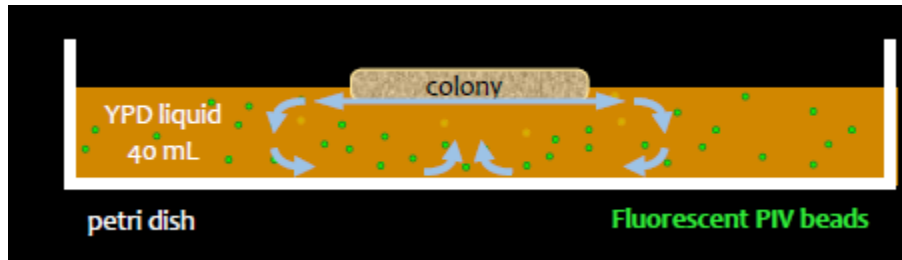


Vorticity equation:  $\vec{\omega} = \nabla \times \vec{u}$

$$\frac{\partial \vec{\omega}}{\partial t} + (\vec{u} \cdot \nabla) \vec{\omega} = (\vec{\omega} \cdot \nabla) \vec{u} + \frac{1}{\rho^2} (\nabla \rho \times \nabla p) + \nu \nabla^2 \vec{\omega}$$

A thresholdless baroclinic instability generates a ring of vorticity beneath the colony....

# Lubrication approximation for growth with radial stretching in liquid colonies



$$\frac{\partial H(\vec{r}, t)}{\partial t} + \vec{\nabla} \cdot [H(\vec{r}, t) \vec{v}(\vec{r})] = D \nabla^2 H(\vec{r}, t) + \mu H(\vec{r}, t) [1 - H(\vec{r}, t)]$$

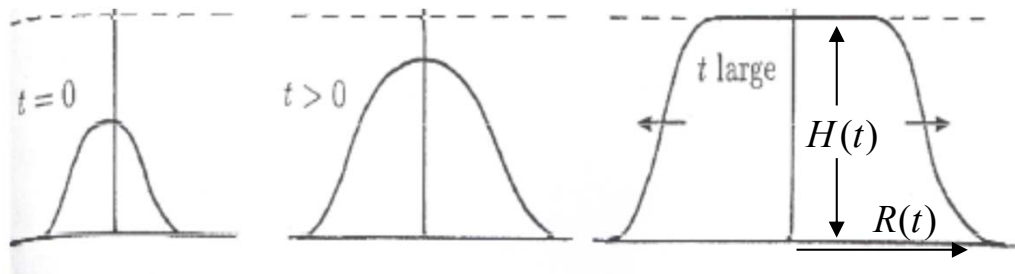
$\vec{v}(\vec{r}) \approx \frac{1}{2} \alpha r \hat{r}$ ;  $\alpha$  contains effects of both colony pushing & a metabolically generated vortex ring

$R(t) \approx R(0) e^{\frac{1}{2} \alpha t}$ , exponential growth accompanied by colony thinning

$$H(t) \approx \frac{e^{(\mu - \alpha)t} H(0)}{1 + \frac{\mu H(0)}{H_0 (\mu - \alpha)} [e^{(\mu - \alpha)t} - 1]}$$

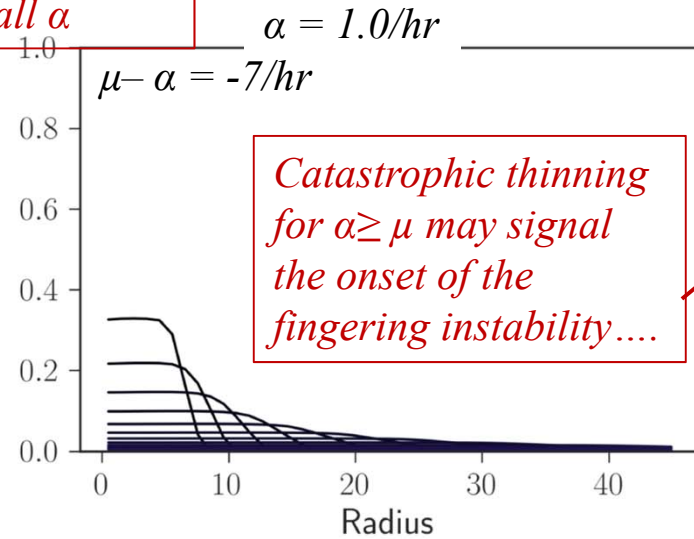
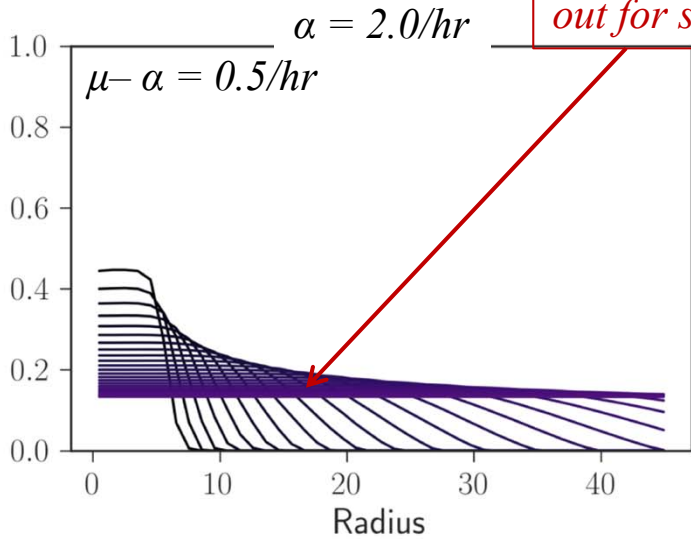
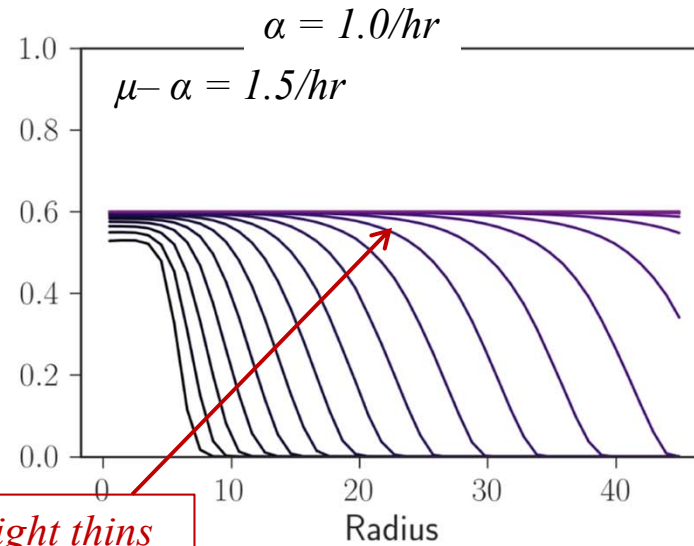
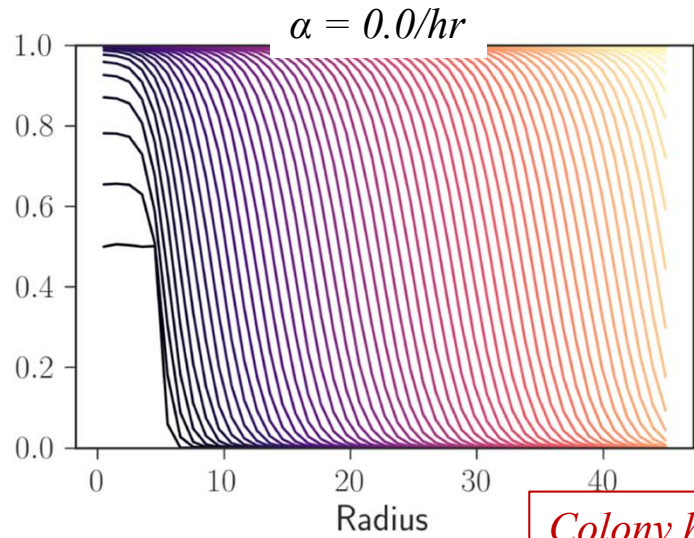
$$\lim_{t \rightarrow \infty} H(t) = H^* = H_0 (1 - \alpha / \mu), \quad \alpha < \mu$$

$$\lim_{t \rightarrow \infty} H_0(t) = 0, \quad \alpha < \mu$$



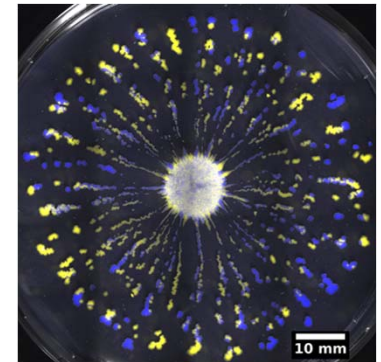
*Radial height profiles  
with different radial  
flows  $v(r)=ar/2$*

variable  $\mu - \alpha$ ; equal time intervals



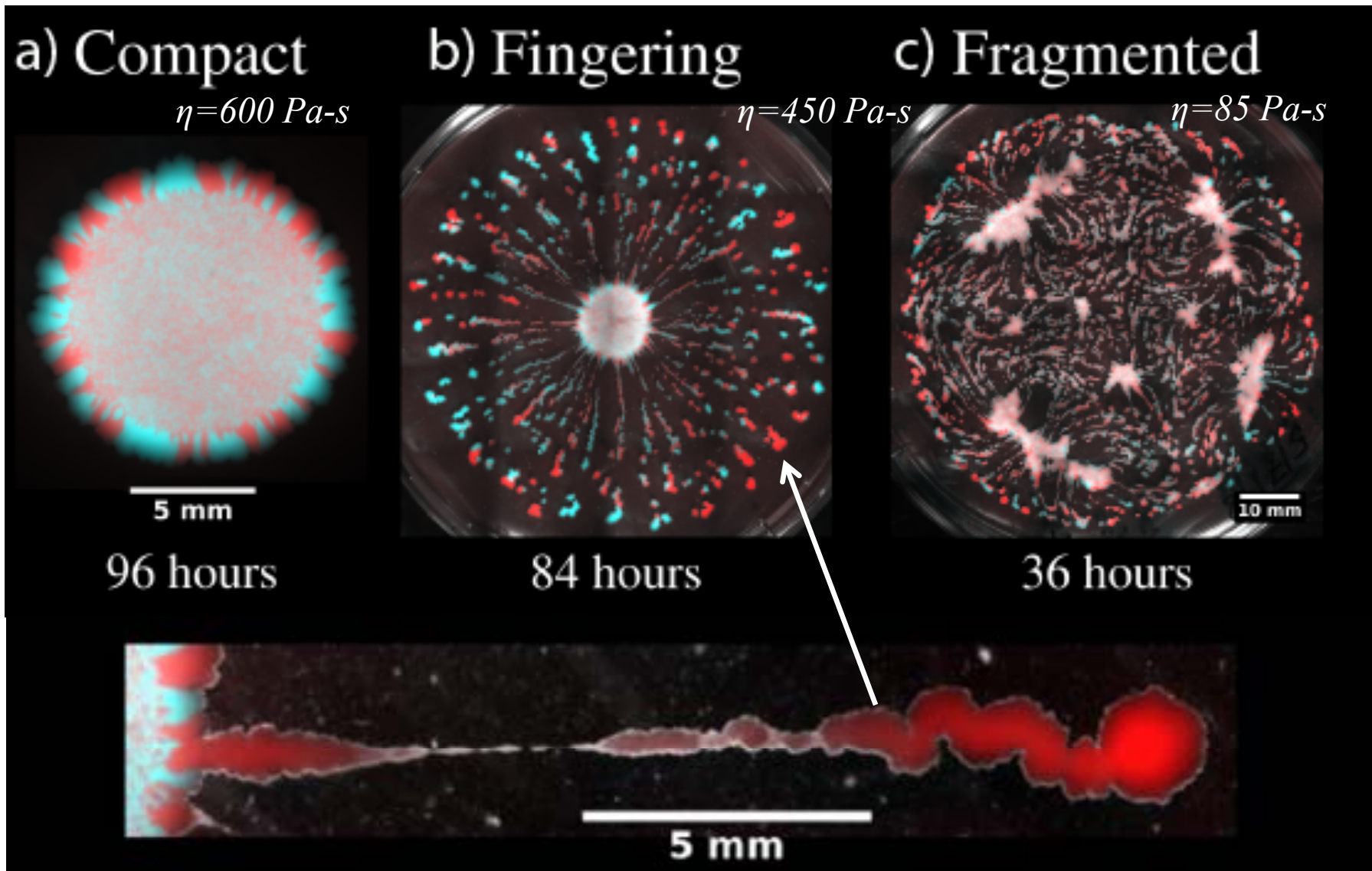
*Colony height thins out for small  $\alpha$*

*Catastrophic thinning for  $\alpha \geq \mu$  may signal the onset of the fingering instability....*

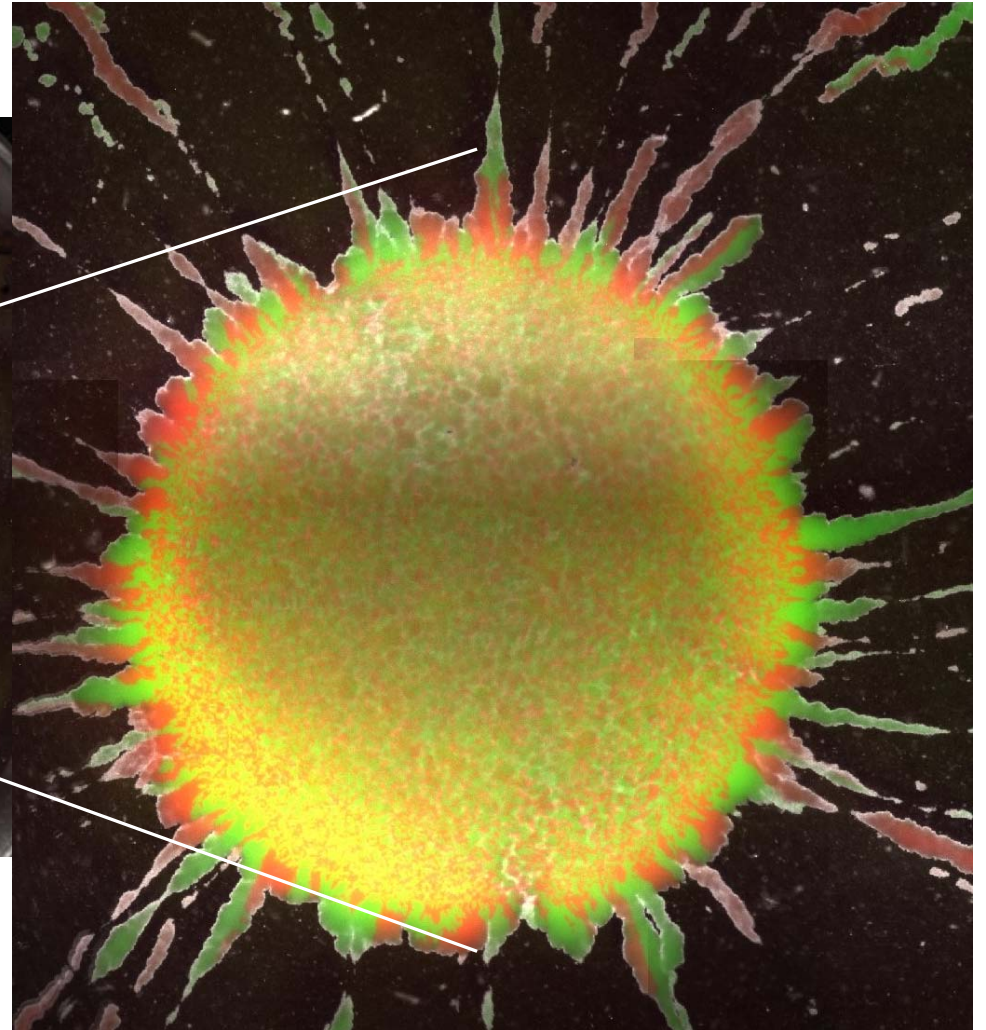
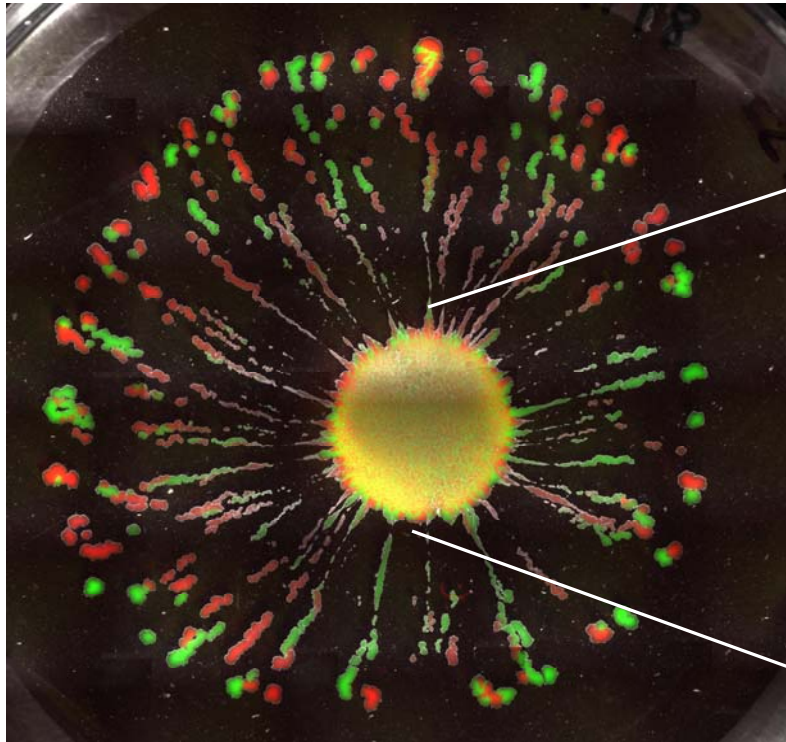




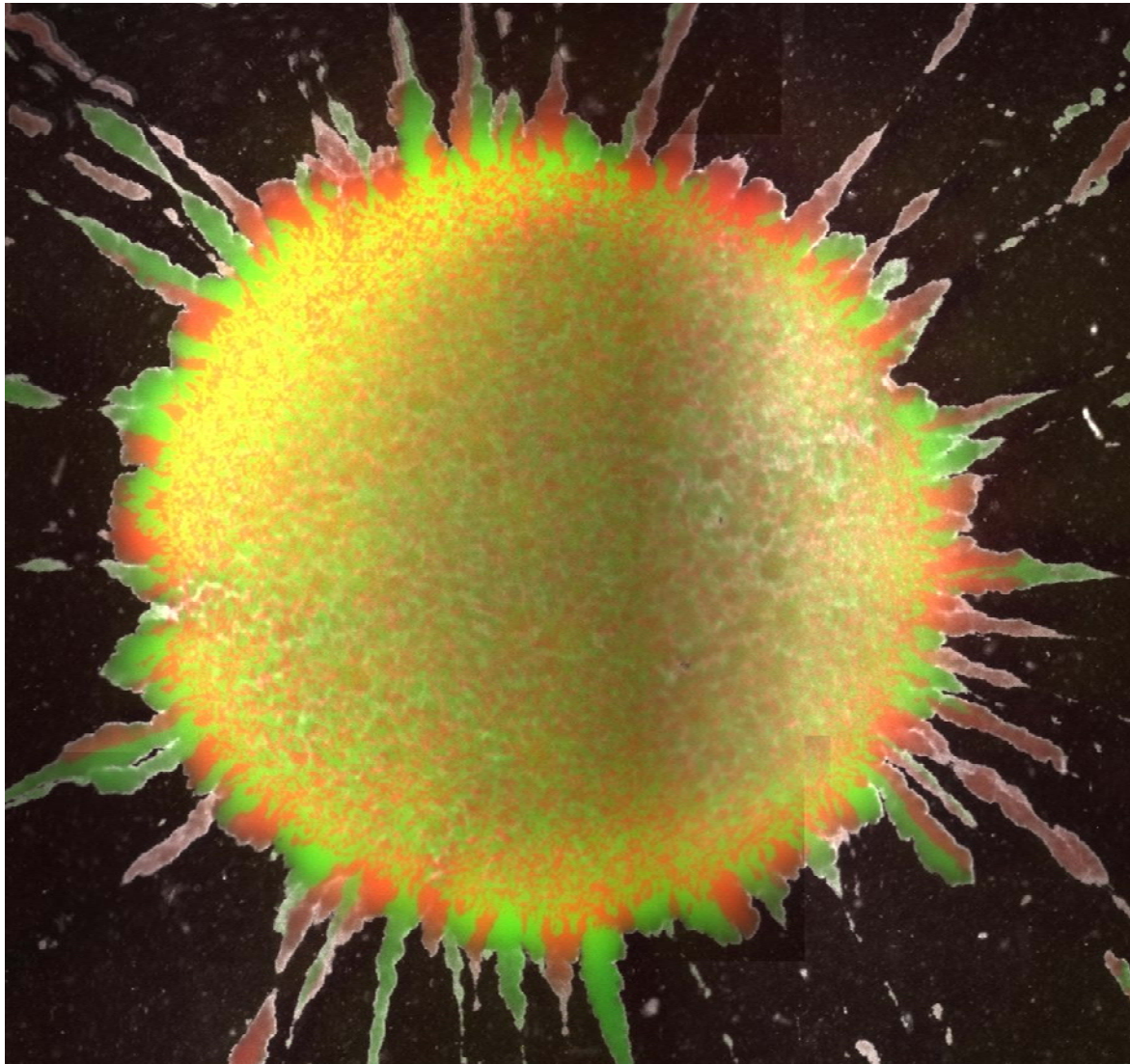
*Summary: Range expansions on liquid substrates exhibit three qualitatively different viscosity-dependent morphologies*



*Could the fingering instability be due to the discreteness of the  $\sim 5\mu$  yeast cells?*

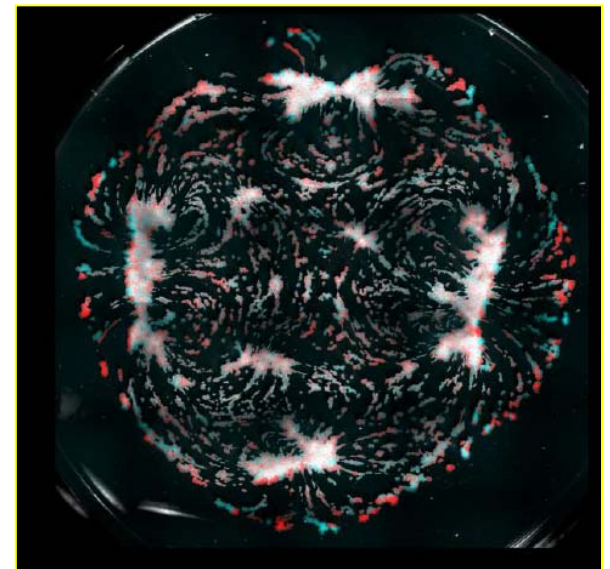
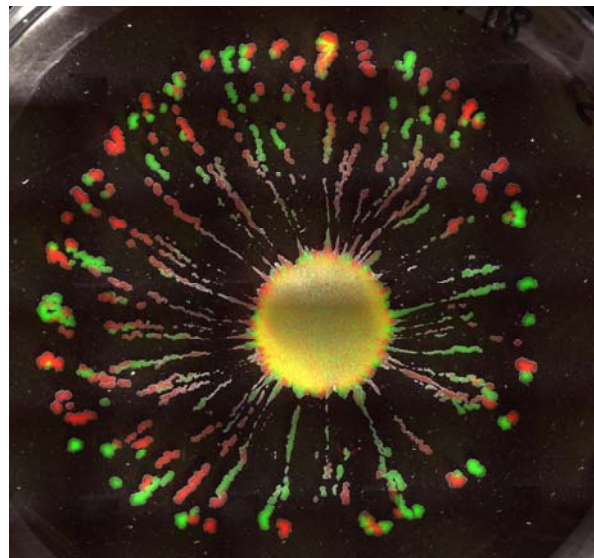
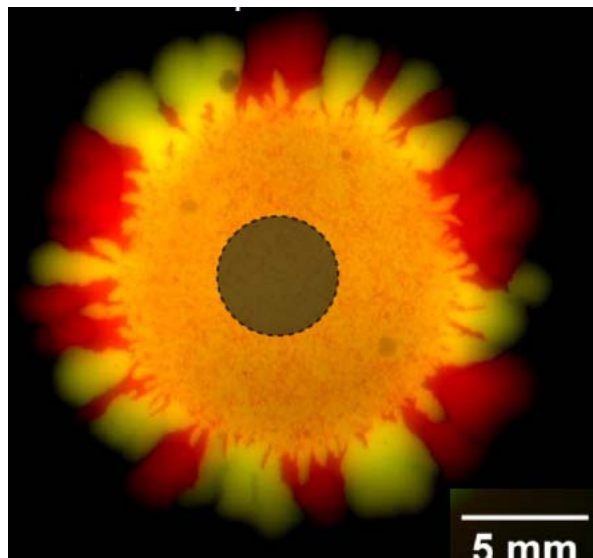


*Could the fingering instability be due to the discreteness of the  $\sim 5\mu$  yeast cells?*



# On Growth and Form of Microorganisms on *Liquid* Substrates

“Microbes on the surface of a highly viscous liquid generate buoyant flows that alter colony morphology and evolutionary dynamics”



***Thank you!!***

Severine Atis  
Bryan Weinstein  
Andrew Murray

