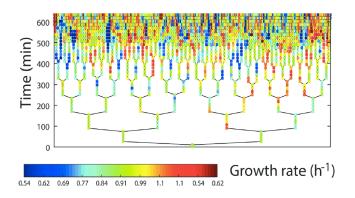
# Linking lineage and population observables in biological branching processes

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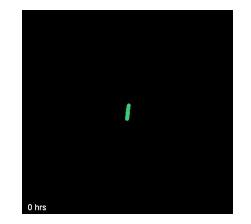




• Time-lapse microscopy of a bacteria colony :

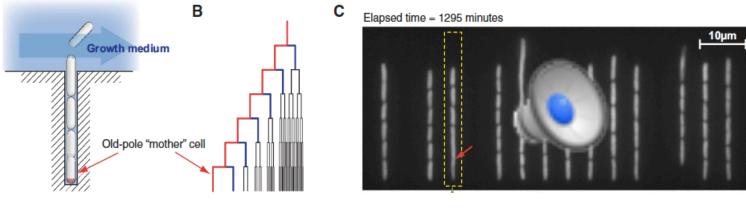


S. Lahiri et al. 2017



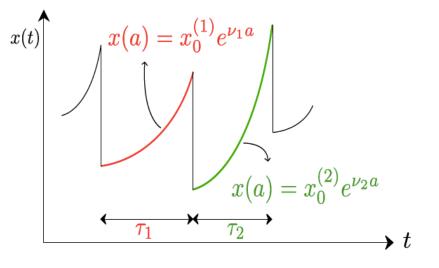
D. J. Kiviet et al. 2014

• Mother machine configuration :

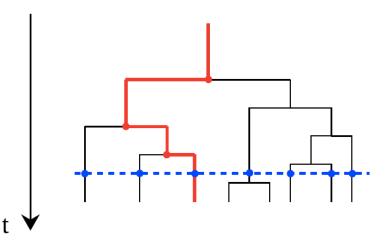


P. Wang et al. 2010

- Parametrization of exponential growth :
  A. Amir 2014 L. Robert 2014
  - Continuous stochastic map
  - Various models of control :
    - size models
    - age models



- Three levels of description :
  - Lineage
  - Snapshot
  - Tree



## Cell population dynamics

• Dynamical equation for the number density of cells

$$\partial_t n(\mathbf{y}, t) = -\nu \partial_x [xn(\mathbf{y}, t)] - B(\mathbf{y})n(\mathbf{y}, t) + 2 \int d\mathbf{y}' \Sigma(\mathbf{y}|\mathbf{y}')B(\mathbf{y}')n(\mathbf{y}', t),$$

where

- $\mathbf{y} = (x, \nu)$  for cells of size (or *copy number*) x and single cell growth rate  $\nu$
- $B(\mathbf{y})$  division rate
- Factor 2 represents the number of progeny per cell division
- $\Sigma(\mathbf{y}|\mathbf{y}')$  probability of daughter to be in state  $\mathbf{y}$  given the mother cell is in state  $\mathbf{y}'$ A particular case : symmetric division at constant single cell growth rate

$$\Sigma(\mathbf{y}|\mathbf{y}') = \delta(\nu - \nu')\delta(x - x'/2)$$

• Normalisation 
$$\int d\mathbf{y} \Sigma(\mathbf{y}|\mathbf{y}') = 1$$
 and  $p(\mathbf{y},t) = rac{n(\mathbf{y},t)}{N(t)}$ 

Total population 
$$N(t) = \int d\mathbf{y}n(\mathbf{y}, t)$$
 and total volume  $V(t) = \int d\mathbf{y}xn(\mathbf{y}, t)$ 

• Growth rate of the population 
$$\ \Lambda_p(t)={\dot N\over N}$$
 and of the volume  $\ \Lambda_V(t)={\dot V\over V}$ 

In general 
$$\Lambda_V(t) = \Lambda_P(t) + \frac{d}{dt} \ln \int d\mathbf{y} x p(\mathbf{y}, t)$$

• In a steady state 
$$\lim_{t \to \infty} \Lambda_P(t) = \lim_{t \to \infty} \Lambda_V(t) = \Lambda$$

- For a lineage similar equation for  $\ p(\mathbf{y},t)$  as for  $\ n(\mathbf{y},t)$  but with no factor 2

## First fluctuation relation (FR) to link both levels

Cell trajectory  $\{\mathbf{y}\} = \{\mathbf{y}\}_0^t$ 

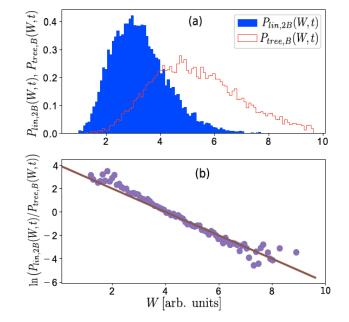
Dynamical activity:  $W_t(\{\mathbf{y}\}) = \int_0^t dt' B(\mathbf{y}(t'))$ Time averaged population growth rate  $\Lambda_t = \frac{1}{t} \ln \frac{N(t)}{N(0)}$ 

• First FR :

$$\langle A(\{\mathbf{y}\})\rangle_{tree,B} = \langle A(\{\mathbf{y}\})e^{W_t(\{\mathbf{y}\})-t\Lambda_t}\rangle_{lin,\mathbf{2}B}$$

Crooks like relation G. Crooks 2000

$$P_{tree,B}(W,t) = P_{lin,2B}(W,t)e^{W-t\Lambda_t}$$

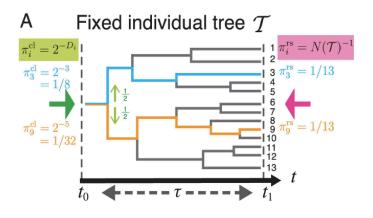


## A second FR holds at the same division rate

$$P^{tree}(\{\mathbf{y}\}) = P^{lin}(\{\mathbf{y}\})e^{K\ln 2 - t\Lambda_t}$$

Here  $K = K({\mathbf{y}})$  counts the number of divisions, related to fitness

There is a statistical bias present in choosing one individual uniformly in a population as opposed to following a lineage



T. Nozoe et al. 2017 T. J. Kobayashi et al. 2015 Chronological probability distribution forward in time =  $P^{tree}({\mathbf{y}})$ Retrospective probability distribution backward in time =  $P^{lin}({\mathbf{y}})$ 

### Consequences for mean generation times

• In the long time limit  $t/\langle K \rangle \to \langle \tau \rangle$  and  $\Lambda_t \to \Lambda$ 

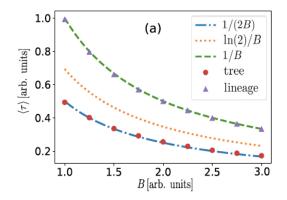
then

$$\langle \tau \rangle_{tree} \leq T_d \leq \langle \tau \rangle_{lin}$$

with  $\ T_d = \ln 2 / \Lambda$  the population doubling time

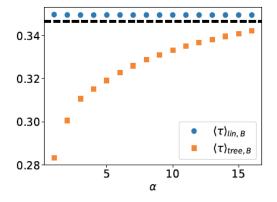
#### For constant division rate

$$B = \Lambda$$



#### For non-constant division rate

$$B(x,\nu) = \nu x^{\alpha}$$

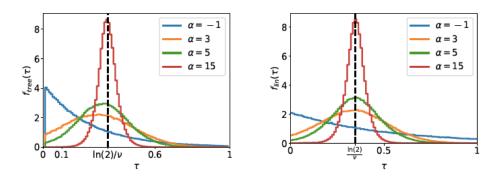


## Generation times distributions

- For constant division rate  $f_{lin,B}(\tau) = B \cdot e^{-B\tau}$ 

$$f_{\text{tree},B}(\tau) = f_{\text{lin},2B}(\tau)$$

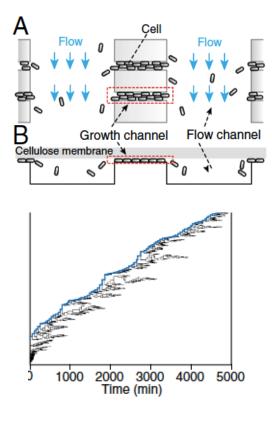
- For non-constant division rate  $B(x,\nu) = \nu x^{\alpha+1}$ 



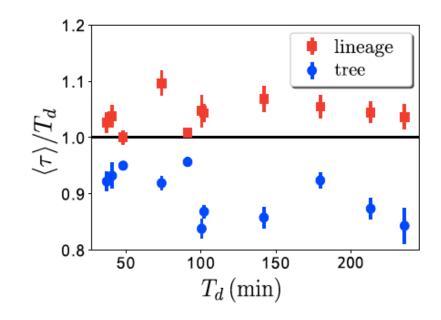
Distributions become peaked near  $T_d$  as  $\alpha$  increases

For the tree distribution, the mean is always less than  $T_d$ 

## **Experimental tests**



M. Hashimoto et al. 2015



- Both inequalities are verified in this experiment
- Interpretation used in the paper : an age model with negligible mother-daughter correlations

# Conclusions

- A fluctuation relation captures a statistical bias present in the statistics of the branched tree when compared to lineage statistics
- Inequalities for generation times are satisfied by age models without mother-daughter correlations and by size models.
- Fluctuations of single cell growth rate have an impact on the population growth rate

A. Genthon, R. Garcia-Garcia, D. L. Phys. Rev. E, 99, 042413 (2019)