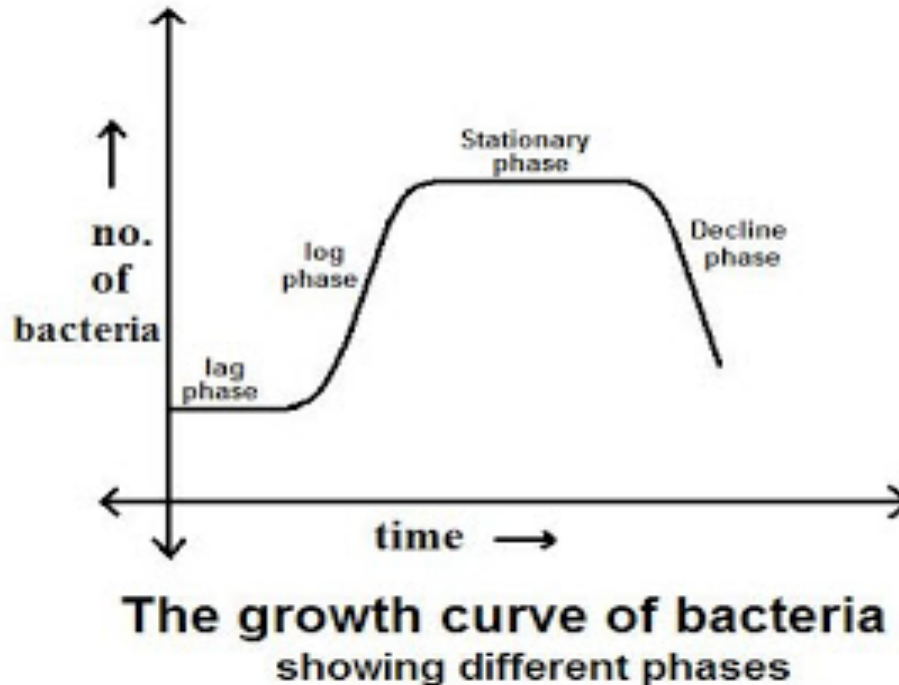


# On the Persistence of Populations

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Symposium in Honour of Olav Kallenberg  
Mittag-Leffler Institute, 24 – 28 June, 2013  
(Joint work with and Fima Klebaner et al.)

# We all know what it is like...



After some hesitation, we either die out or increase in numbers, until we have filled the earth. We persist, and we die out.

# But branching processes teaches

- that a (small) population either dies out or grows exponentially,
- that large extinction probability does not preclude rapid growth, where it occurs,
- that there may thus well be frequent extinction during growth,
- and that the composition (age-distribution, type-, pedigree...) stabilises during infinite growth.
- But what about (real) populations that either die out or display a long quasi-stationary phase, and then die out?

# What's lacking in branching?

- Individual reproduction  $\rightarrow$  population change  $\rightarrow$  environment  $\rightarrow$  individual reproduction.
- Each habitat (“island”) has a Carrying Capacity  $K$  (for the species) such that reproduction turns subcritical whenever population size  $Z_t > K$ .
- In discrete time, the meaning is obvious: individuals beget children independently, given generation size  $z$ , and the offspring mean  $m(z)$  is a decreasing (no cooperation) function of  $z$ ;  $m(1) > 1$  and  $m(K) = 1$ .
- Toy example:  $p_2(z) = K/(K+z)$ ,  $p_0 = 1 - p_2$ .
- Klebaner, Sagitov, Vatutin, Haccou, and PJ in J. Biol. Dyn. 5, 2011.

If the starting number  $Z_0 = z < K$ ,  $T$  = time to extinction, and  $T_a$  = time to reaching size  $dK$ ,  $0 < d < 1$  (the time of ascent), then  $P(T < T_a) \leq d^z$ .

- At any  $k < dK$ ,  $p_0(k) = k/(K+k) < dK/(K+dK) = d/(1+d)$ .
- Hence the probability of dying out without crossing  $dK$  must be smaller than the same probability for a binary G-W  $\{Y_n\}$  with  $P(\text{no children}) = d/(1+d)$ . But  $P_z(Y_n = 0 \text{ before } dK) \leq P_z(Y_n \rightarrow 0) = q^z$ .
- And  $q = d/(d+1) + (1/(d+1))q^2$ , yielding  $q = d$ .

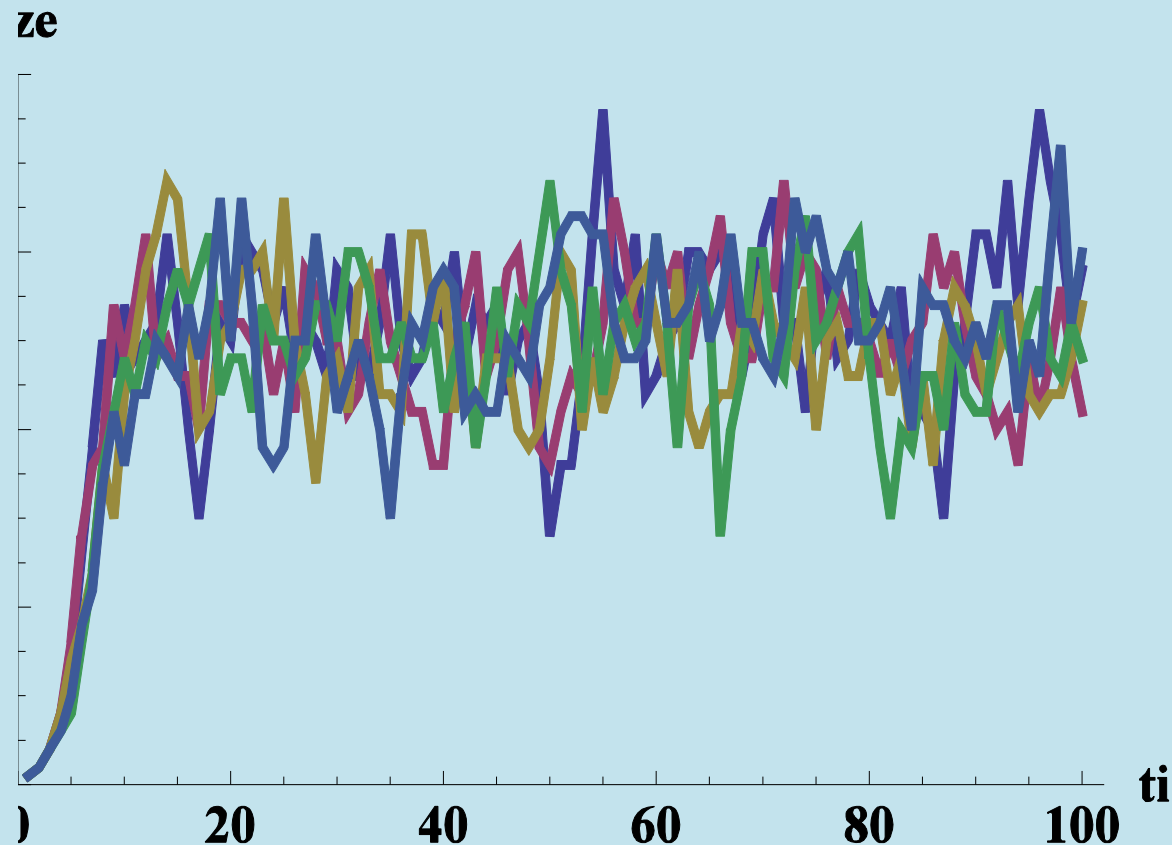
# Lingering around $K$

- And once in a band around  $K$ , the population stays there for a long time, of the order  $e^{cK}$  for some  $c > 0$ , with a probability that  $\rightarrow 1$ , as  $K \rightarrow \infty$  (Large Deviation Theory).
- In this example  $c$  can be calculated – large deviations for binomial r. v., (Janson),
- $c = d(1-d)^2 / 8(1+d)$  .
- For any  $K$ , the expected time to leaving a band  $(1 \pm \delta)K$  is  $O(e^{cK})$ ,  $\delta = 1-d$ .

The time of ascent  $T_a = O(\log K) = T_d$ ,  
the time of descent

- $Z_n \geq Y_n$  on  $\{T_a \geq n\}$ , where  $\{Y_n\}$  binary G-W with  $P(\text{no children}) = d/(1+d)$ .
- Hence,  $dK \approx Z_{T_a} \geq Y_{T_a} \approx W(2/(1+d))^{T_a}$  and
- $T_a = O(\log K)$ .
- At least for non-population-dependent general branching processes, also  $T_d = O(\log K)$  (PJ and Klebaner: On the Path to Extinction, PNAS, 2007).

And this is what things look like in a simulated world:



$K=50$ , and not one direct extinction among 10 simulations.

# Is this behaviour general, and what happens during the long plateau phase?

- Birth during life, and/or split at death, after a life span with an arbitrary distribution, all dependent upon population size, in this way:
- If the age structure is  $A=(a_1, a_2, \dots, a_z)$ , the birth rate of an  $a$ -aged individual is  $b_A(a)$  and the death rate is  $h_A(a)$ .
- Litter size then is 1.
- At death  $\xi$  (bounded) children are produced. The distribution may depend on mother's age at death and on  $A$ . Expectation and variance:  $m_A(a)$ ,  $v_A(a) < \infty$ .
- **Population size dependence:**  $b_A=b_z$ ,  $h_A=h_z$ , etc.

# Markovianness

- The process is **Markovian in the age structure**,  $A_t$  = the array of ages at  $t$ ,  $Z_t = (1, A_t)$ ,  $(f, A) = \sum f(a_i)$ ,  $A = (a_1, \dots, a_z)$ .
- $L_z f = f' - h_z f + f(0)(b_z + h_z m_z)$ 
  - $f'(a)$  reflects linear growth in age.
  - $h_z(a)$  the risk of disappearing,
  - $b_z(a)$  the birth intensity, resulting on a 0-aged individual, and
  - $h_z(a)m_z(a)$  is the splitting intensity.
- Dynkin's formula: For  $f \in C^1$ ,
- $(f, A_t) = (f, A_0) + \int_0^t (L_{Z(s)} f, A_s) ds + M_t^f$ , where  $Z(s) = Z_s$  and  $M_t^f$  is a local square integrable martingale (PJ & FK 2000)
- In particular,
- $Z_t = (1, A_t) = Z_0 + \int_0^t (b_{Z(s)} + h_{Z(s)}(m_{Z(s)} - 1), A_s) ds + M_t^f$ .

# Growth

- $Z_t = Z_0 + \int_0^t (b_{Z(s)} + h_{Z(s)}(m_{Z(s)} - 1), A_s) ds + M_t^f$   
means that there is a growth trend at  $t$  iff
- $(b_{Z(t)} + h_{Z(t)}(m_{Z(t)} - 1), A_t) > 0$ .
- The most natural criticality concept is thus **criticality in the age distribution**:
- $(b_{Z(t)} + h_{Z(t)}(m_{Z(t)} - 1), A_t) = 0$ .
- A stronger concept is **strict criticality** at population size  $z$ :
- $b_z(a) + h_z(a)(m_z(a) - 1) = 0$  for all  $a$ .

# Criticality and Monotonicity

- Finally, a population can be called **annealed critical** at a size  $z$  if the expected number of children during a whole life in a population of that size is  $= 1$ .
- The three concepts coincide for Bellman-Harris type age-dependent branching processes.
- We work with strict criticality at  $K$ .
- Assume monotonicity in the sense that if  $\{Z_t'\}$  and  $\{Z_t\}$ , are annealed at sizes  $z' \leq z$ , but start the same, then  $Z_t' \geq Z_t$  in distribution.

# The risk of direct extinction

- Then, the probability of direct extinction, without reaching  $dK$ ,  $0 < d < 1$ , is  $\leq q_d^z$ , where:
  - $q_d < 1$  is the extinction probability of a supercritical branching process with the fixed reproduction determined by size  $dK$  – the annealed extinction probability and
  - $z$  is the starting number.
- The chance of reaching  $dK$  is  $\geq 1 - q_d^z$ , if  $Z_0 = z$ .
- With  $m_d$  and  $v_d$  the reproduction mean and variance. of the embedded GW-process, annealed at pop size  $dK$ ,  $q_d \leq 1 - 2(m_d - 1)/(v_d + m_d(m_d - 1))$  (Haldane).

## And otherwise:

- By the assumed monotonicity in parameters,  $Z_t$  grows quicker to  $dK$  than does the process annealed there (if it does not die out before).
- Hence, the time to reach the level is  $O(\log K)$ .
- And once there, we would still expect it to remain for a time of order  $e^{cK}$ ,  $K \rightarrow \infty$ , for some  $c > 0$ , by large deviation theory.
- This is proved under technical assumptions in Klebaner and PJ (Journ. Appl. Prob. 48A, 2011).

# Now, let's have a look at the population behaviour around the carrying capacity.

Write  $M(\mathbb{R}^+)$  for the set of finite measures on  $\mathbb{R}^+$ , and assume that

- the population starts from around  $K$  individuals:  $(a_1, \dots, a_z)/K = A_0^K \rightarrow A_0$ , as  $K \rightarrow \infty$ .
- the support of  $A_0^K$  and its total mass are bounded:  $\sup_K \inf \{t > 0: A_0^K((t, +\infty)) = 0\} < \infty$  and  $\sup_K A_0^K < \infty$ .
- If  $\exists C > 0; \forall A \in M(\mathbb{R}^+) |(L_A f, A)| \leq C(1 + f, A)$ , where  $C$  may depend on  $f$ , then for any  $A$ ,  $(f, A_t)$  is integrable and its expectation is bounded,
- All demographic parameters are uniformly bounded.

(If the population starts small it will reach any vicinity of the carrying capacity in time  $O(\log K) \ll K$ .)

# Then:

- $\{A_t^K, t \geq 0\}_K$  is tight in  $D(\mathbb{R}^+, M(\mathbb{R}^+))$ .
- Proof by Jakubowski's criteria, compact containment + tightness of integrals of a separating family of continuous functions closed under addition (coordinate tightness).

# Stabilisation

- Add to earlier assumptions of boundedness of parameters and stabilisation of the initial age distribution  $A^K_0$ , as  $K \rightarrow \infty$ , that
- parameters are Lipschitz in the Levy-Prohorov distance  $\rho$ :  $|b_A^K(u) - b_B^K(u)| \leq C\rho(A/K, B/K)$  and the same for  $h_A^K$  and  $m_A^K$  (Lipschitz density dependence).
- Then, the processes  $A^K = \{A_t^K; t \geq 0\} \rightarrow$  some  $A^\infty$ , weakly in  $D(\mathbb{R}^+, M(\mathbb{R}^+))$ , as  $K \rightarrow \infty$ .

# What is the limit?

- If  $\mu^K/K \Rightarrow \mu$ , then the demographic parameters also converge:  $b_{\mu^K} \rightarrow \text{some } b_{\mu} \text{ etc.}$  and so does the infinitesimal operator corresponding to them,  $L_{\mu^K} \rightarrow L_{\mu}$ ,  $L_{\mu^K} f = f' - h_{\mu^K} f + f(0)(b_{\mu^K} + h_{\mu^K} m_{\mu^K})$ .
- The limit  $A = A^{\infty}$  satisfies
- $(f, A_t) = (f, A_0) + \int_0^t (L_{A_s} f, A_s) ds$ .
- This is a weak form of the classical McKendrick-von Foerster differential equation for the density  $a(t, u) = A_t'(u)$  of  $A_t$ :
- $(\partial/\partial t + \partial/\partial u)a(t, u) = -a(t, u)h_{A_t}(u)$ , which can be solved in special cases, like when  $h_{A_t}(u)$  is constant or only depends upon  $|A_t|$ .

# Summary

- A population in a habitat that can carry a large number of individuals  $K$ , and where parameters stabilise as  $K \rightarrow \infty$ ,
- grows to around  $K$  in time  $\log K$
- lingers there for a time  $e^{cK}$ , while its age distribution stabilises to  $A = A^\infty$ , given by the McKendrick-von Foerster equations,
- and then it dies out in time  $\log K$  (?).