# Structure Dependent Branching Processes - problems and ideas.

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# Classical branching processes - delightful mathematics. But as population biology?

- 1. No sex (In branching processes) a woman needs a man like a fish needs a bicycle (Irina Dunn, Australian Parliament Senator).
- 2. No limitations, no competition; extinction or exponential growth for ever!
- (1) Our hosts' showpiece, but little for general processes in continuous time. (2) Attempts from us and others: population size dependence.

### First: (2) Population size- and agedependent processes

- Birth during life, and/or split at death, after a life span with an arbitrary distribution, all dependent upon individual age and population size:
- The birth intensity of an a-aged individual in a population of size z is b<sub>z</sub>(a) and the death rate similarly h<sub>z</sub>(a).
- At death children may also be produced. The distribution of their number  $\{p_z(a)_k; k=0,1,2,3,...\}$  may depend on mother's age a at death and on the age and on the size z then.
- Denote the population size at t by  $Z_t$ , and the whole vector of ages by  $A_t$ , so that  $Z_t = |A_t|$ .

# Population Feedback Loop: Individual reproduction -> population change -> environment -> individual reproduction.

- Some (most?) populations exhaust their environment, and can't persist. But what about those who don't and live sustainably?
- Still their habitat has a Carrying Capacity K: small populations are supercritical but reproduction turns subcritical whenever population size Z<sub>t</sub> > K.
   Sustainability means that K is not eroded but remains constant.

# What about such populations, starting from a little $Z_0$ (think: 1)?

- Extinction or invasion?
- Growth phase up to around K exponential?
- Persistence for ever? No way.
- The duration of the plateau phase, in between the growth stage and that of decline into ultimate extinction for K large – more difficult.
- The behaviour during the time around K stabilising age distributions, as K  $\rightarrow \infty$  ?
- Extinction phase what do the path and time to ultimate extinction look like?

#### The initial stage: Extinction or Invasion

- One basic assumption, monotonicity in viability: if  $\{Y_t\}$  is a not population size dependent process with parameters frozen at  $z \leq Z_u$ ,  $u \leq t$ , and  $Z_0 = Y_0$ , then  $Y_t \geq Z_t$  in distribution. The converse holds, if  $z \geq Z_u$ . And a simple remark:
- If  $T_a = \inf \{ t; Z_t \ge aK \}$ , then  $Z_t \ge Y_t$  on  $\{ T_a \ge t \}$ , where  $\{ Y_t \}$  is the process with parameters frozen at aK and  $Y_0 = Z_0 = z < aK$ .
- Write T = time to extinction.
- $P_K(early\ extinction) = P(T<T_a) = P(sup\ Z_t < aK) \le P(sup\ Y_t < aK) = P(Y_t \rightarrow 0) = q(aK)^z$ , if q(y) denotes the classical extinction probability of the process with parameters frozen at population size y.

#### But can't we do better?

- Using ideas from epidemic processes (Ball, Barbour, cf. the next talk!) we can couple the population-size-dependent process to an ordinary branching process, starting the same and with the parameters frozen, as long as  $Z_t = o(\sqrt{K^2/3})$ ?).
- Argument: keep the successive birth points of the branching process with probabilities = ratios of the relevant birth intensities. Regard life spans as marks of the points, converging as  $K \rightarrow \infty$ .
- Hence,  $q(aK)^z \ge P_K(early\ extinction | Z_0=z) \rightarrow q(z)^z$ .
- Hope: the first step of a unified description of the whole population life cycle.



Keep a birth at time t with probability  $b_{z(t)}^{K}(a_{t}^{mother})/b_{z(0)}^{K}(a_{t}^{mother})$ . Take the infimum  $\gamma(xK,K)$  over ages and study  $\gamma(xK,K)^{z(\tau(K)})$ , where x(t)K=z(t), and  $\tau(K)$  is a time point chosen so that this  $\rightarrow$  1, as  $K\rightarrow\infty$ .

#### Growth

- If a branching process does not die out, it grows exponentially:
- Hence,  $aK \approx Z_{T_a} \geq Y_{T_a} \approx We^{\alpha(aK)T(a)}$ , W a nonnegative r.v. with E[W] = z,  $\alpha(aK)$  is the Malthusian parameter of the  $\{Y_t\}$ -process and  $T(a) = T_a < \infty$ .
- In other words,  $T_a = O(\log K)$ , if it is finite.

### The (Quasi-)Stationary Phase

- Once in the vicinity of K, population size should linger there for a time that is exponential in K, as  $K \rightarrow \infty$ , by large deviation theory.
- Under technical assumptions we proved:
- Assume  $Z_0/K \to 1$  in probability, as  $K \to \infty$ . Then  $Z_t/K \to 1$ , uniformly in probability on any bounded t-interval, as  $K \to \infty$ .
- Assume  $Z_0/K = 1$ . Write  $\tau^K = \inf\{t; |Z_t/K-1| > \epsilon\}$ . Then, for some C, c > 0,  $E[\tau^K] > Ce^{cK}$ , FK & PJ in JAP 2011. Stronger results for some discrete time, binary splitting processes (Klebaner, Sagitov, Vatutin, Haccou, and PJ.)

## What happens during the pseudo-stable stage?

- Assume h<sup>K</sup>, b<sup>K</sup>, m<sup>K</sup> all bounded and Lipschitz, in the sense that
- $|h_z^{K}(a)-h_y^{K}(a)| \leq C|z-y|/K$ ,
- and that the initial age distribution  $A_0^K/K$  has bounded total mass and converges weakly to some  $A_0^\infty$ , as  $K \rightarrow \infty$ . Then,
- The age distribution process  $\{A_t^K/K; t \ge 0\}$  is tight and converges weakly, as  $K \to \infty$ , in Skorohod space  $D(R_+,M(R_+))$ , to a non-random limit, describable by the classical McKendrick-von Foerster equation for its density,
- $(\partial_t + \partial_u)a(t,u) = -a(t,u)h_{Z(t)}$ .
- What about the type distribution?

#### The Time of Descent

- Thus, finally any band around K will be left, never to be returned to.
- So, how long, T<sub>d</sub>, does it take from then until extinction?
- For classical, general subcritical branching processes starting from aK, the time to extinction is O(log K) (PJ, Klebaner, and Sagitov: On the Path to Extinction, PNAS, 2007).
- By a comparison argument the corresponding is true here: E[T<sub>d</sub>|no return to bK, b<1] = O(log K), if start from aK, 0<a<b. ( J. Math. Biol. 2016)</li>

# General Branching with Structure Dependence

- It's now merely a matter of notation to generalise, having individual life dependent not only on population size and but also upon composition:
- If the age structure is  $A=(a_1, a_2, ..., a_z)$ , the birth rate of an a-aged individual is  $b_A^{(a)}$  and the death rate similarly  $h_A^{(a)}$ .
- At death children may also be produced. The distribution  $\{p_A(a)\}$  may depend on mother's age a at death and on the age configuration A then.

### But what is criticality in an agestructured population?

- (Super/sub)critical, as Z<sub>t</sub> (</>)=K. Frozenly?
   Independently of ages?
- Introduce a criticality function:

$$\chi_{A} = b_{A} + h_{A}(m_{A}-1),$$

And the generating function  $\phi_A$  of the number of children at splitting. To prove exponential holding time we used:

- Births during mother's life occure one by one.
- $-|\chi_A| \le C||A|/K-1|$  (Lipschitz at K) and
- $(e^{1/K}-1)b_z + (\phi_z (1/K) e^{-1/K}-1)h_z \le 0 \text{ for } z > CK$  (subcriticality at overcrowding)

### Strict criticality

- The Lipschitz condition implies strict criticality,
- $\chi_A$  = 0, if |A|=K. OK for Bellman-Harris and b.a.d. processes. But not in general, where child bearing and death occurs at different ages.
- Maybe we can try Lipschitz in composition,  $|(\chi_A, A)/K| \le C||A|/K-1|$ , for  $A/K \to A_\infty$ ?
- $(f,A) = \int f dA$ .

### High time for sex!

- At the cost of more burdensome notation, the preceding formulation extends to age- and type-structure dependent reproduction, , S=(a<sub>1</sub>, t<sub>1</sub>, a<sub>2</sub>, t<sub>2</sub> ..., a<sub>z</sub> t<sub>z</sub>), the s-birth rate of a t-type a-aged individual is b<sub>s</sub><sup>s</sup>(a,t) and death rate and splitting probabilities similarly.
- We have a look at two-sex populations:  $t_i = 2$  or 3, a new-born being female with, say, probability 1/2, independently of everything else.

## Recall: General processes are (and are not) Markov!

- If the process is single type, it is Markovian in the age and structure,  $A_t$  the array of ages at t,  $Z_t = (1,A_t)$ ,  $A = (a_1, t_t, ...a_z, t_z) and correspondingly, but more burdensome, in the multi-type case:$
- $L_A f = f' h_A f + f(0)(b_A + h_A m_A)$ 
  - f'(a) reflects linear growth in age.
  - $-h_{r}(a)$  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  $f \in C^1$ ,
- $(f, A_t) = (f, A_0) + \int_0^t (L_{A(s)}f, A_s)ds + M_t^f$ , where  $A(s) = Z_s$  and  $M_t^f$  is a local square integrable martingale.
- In particular,
- $Z_t = (1, A_t) = Z_0 + \int_0^t (b_{A(s)} + h_{A(s)}(m_{A(s)} 1), A_s) ds + M_{t.}^f =$
- =  $Z_0 + \int_0^t (\chi_{A(s)}, A_s) ds + M_t^f$ , a martingale where  $(\chi_{A(t)}, A_t) = 0$ , explaining the role of criticality or Lipschitz in composition.

#### In the two-sex case:

- f:  $\{P, \sigma^1\} \times R_+ \to R_+$  with f boundedly differentiable in the second argument yields the f-measured population process  $(f,S_+)$  with the rate of change
- $L_S f = f' h_S f + b_S (f(?, 0) + f(3, 0))/2$ , where  $b_S (3, \cdot) = 0$ , and there is no birth by splitting. Dynkin's formula:
- $(f,S_t) = (f,S_0) + + \int_0^t (L_{S(u)}f, S_U)ds + M_t^f$ , where  $S(u) = S_u$  and  $M_t^f$  is a local square integrable martingale.
- In this, f=1,  $\delta_{\mathcal{A}}$ , or  $\delta_{\mathcal{A}}$  yields the total population size  $Z_t$ , the number of females  $X_t$  or males,  $Y_t$ , and the birth rate of females should be dependent upon the availability of males.
- Many questions to answer, for Extremadurians and the rest of us!

### Summary

- A population in a habitat that can carry a (not very) large number of individuals K, and where parameters stabilise as  $K \rightarrow \infty$ ,
- dies out initially with a branching process determined probability,
- or else, grows to around K in time log K,
- lingers there for a time O(e<sup>cK)</sup>) generations, which for K > 10.000 and higher organism generation times is practically infinite. In the meantime, its age and type (!) distribution stabilises.
- and then it dies out in time log K.
- Maybe, by this formulation, we can approach two-sex reproduction in continuous time and age-structured populations, avoiding the difficult questions of couple formation.