# **Quasi-stationary distributions**

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AUSTRALIAN RESEARCH COUNCIL Centre of Excellence for Mathematics and Statistics of Complex Systems

# **Quasi stationarity**



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#### Evanescence



# **Quasi stationarity**





#### First contact - 19 July 1978

Quasi stationary Distributions We consider a surgle transient class of a marker Chain states 6, 1, 2, 3, ..... Probability is ultimately absorbed 1 (with prob 1) in a state -1. S \_\_\_\_ one canucchin 7 If we shufted state labels up by 1. aborby state 0 menation class { 1,2,3,...}=T -1 0 2 2 3 When this could for unstance represent absorbury state a populatur which altimately beaus extinct. we consider the chain as bey described by (Qij : i, j > 0) = po Qij > 0 ZQij = 1 a we cancile sub-stochastic matrices Ta suplicity we will assume that the states have period 1. Thename D.V.J Suppose we have a substachastic invectuable chain (Bij). Then for all i, j, the series E Bij 3" have a common vachues of convergence. Suffices to prove that for any i, j the series Zaij's", Zai'n'sn, Zaji'sn, EQ' 3" have some vachuns of convergence.



Think of an observer who at some time t is *aware of the occupancy of some patches*, yet cannot tell exactly which of n patches are occupied.

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What is the chance of there being precisely *i* patches occupied?

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If we were equipped with the full set of state probabilities

$$p_i(t) = \mathbb{P}(X(t) = i), \qquad i \in \{0, 1, \dots, n\},$$

we would evaluate the conditional probability

$$u_i(t) = \mathbb{P}(X(t) = i | X(t) \neq 0) = \frac{p_i(t)}{1 - p_0(t)},$$

for *i* in the set  $S = \{1, ..., n\}$  of transient states.

$$u_i(t) = \mathbb{P}(X(t) = i | X(t) \neq 0) = \frac{p_i(t)}{1 - p_0(t)}, \qquad i \in S.$$

Then, in view of the behaviour observed in our simulation, it would be natural for us to seek a distribution  $u = (u_i, i \in S)$  over *S* such that if  $u_i(t) = u_i$  for a particular t > 0, then  $u_i(s) = u_i$  for all s > t.

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**Key message**: *u* can usually be determined from the transition rates of the process and *u* might then also be a *limiting conditional distribution* (LCD) in that  $u_i(t) \rightarrow u_i$  as  $t \rightarrow \infty$ , and thus be of use in modelling the long-term behaviour of the process.

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**Note**: There are other approaches to modelling quasi stationarity, and indeed other "quasi-stationary" distributions.

# **The Yaglom limit**

Yaglom\* was the first to identify explicitly a LCD, establishing the existence of such for the subcritical Bienaymé-Galton-Watson branching process.

\*Yaglom, A.M. (1947) Certain limit theorems of the theory of branching processes. Dokl. Acad. Nauk SSSR 56, 795–798 (in Russian).

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If the expected number  $\lambda$  of offspring is less than 1, then

$$u_i = \lim_{n \to \infty} \mathbb{P}(X_n = i | X_n \neq 0, X_0 = 1), \qquad i \in S,$$

exists and defines a proper probability distribution  $u = (u_i, i \in S)$  over S.

### **Branching process - supercritical**



### **Subcritical - quasi stationarity?**



# **The Yaglom limit**



# **Subcritical (only just) - quasi stationarity?**



# **The Yaglom limit**



# **Quasi stationarity**





The idea of a limiting conditional distribution goes back much further than Yaglom, at least to Wright\* in his discussion of gene frequencies in finite populations:

"As time goes on, divergences in the frequencies of factors may be expected to increase more and more until at last some are either completely fixed or completely lost from the population. The distribution curve of gene frequencies should, however, approach a definite form if the genes which have been wholly fixed or lost are left out of consideration."

\*Wright, S. (1931) Evolution in Mendelian populations. Genetics 16, 97–159.

The idea of "quasi stationarity" was crystallized by Bartlett\*:

"While presumably on the above model [for the interactions between active and passive forms of flour beetle] extinction of the population will occur after a long enough time, this may (for a deterministic 'ceiling' population not too small, but fluctuations relatively small) be so long delayed as to be negligible and an effective or quasi-stationarity be established."

\*Bartlett, M.S. (1957) On theoretical models for competitive and predatory biological systems. Biometrika 44, 27–42. Bartlett\* later coined the term "quasi-stationary distribution":

"It still may happen that the time to extinction is so long that it is still of more relevance to consider the effectively ultimate distribution (called a 'quasi-stationary' distribution) of [the process] N."

\*Bartlett, M.S. (1960) Stochastic Population Models in Ecology and Epidemiology. Methuen, London.

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\*Van Doorn, E.A. and Pollett, P.K. (2013) Quasi-stationary distributions for discrete-state models (with web appendix). Invited paper. European J. Operat. Res. Available online 31/01/2013.