Measure-valued dynamical systems, with applications to the evolution of aging Introduction to the evolutionary problem David Description of the model Steinsaltz Feynman-Kac Solution Implications of the Solution Dept. of Adding recombination Mathematics and Statistics

> Queen's University

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Warning: We have stochastics, and processes, but no stochastic processes!

Canada age-specific mortality 1995-1997



Evolution of Aging

General idea goes back to A. Weismann (late 19th C.), P. Medawar and G. Williams (1950s):

Late-acting deleterious mutations are subject to less stringent selection control







Salmon





Tortoise

Salmon





Tortoise

Salmon

Mutation-Selection Equilibrium

Intuitive single-locus model: Mutant allele arises at rate v. Selective cost s. Equilibrium when frequency of mutant is v/s. B. Charlesworth (2001): constant reproduction rate λ high "background mortality" µ mutation increases mortality by m at age x constant mutation rate v $cost = me^{-\mu X}$ of total reproduction Expect equilibrium frequency $\frac{\nu}{-e}\lambda x$

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Mathematical framework for single locus, applied to infinite-locus setting.

Selective cost of multiple mutations non-additive.

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Mathematical framework for single locus, applied to infinite-locus setting.

Selective cost of multiple mutations non-additive.

Mutations which act only at one age are extremely unrealistic.



Improved model (S. Evans, K. Wachter, and DS): Mutation space M Mutation rate $v = \sigma$ -finite measure on M Genotype space G = {countable integer measures on M} State of system P = probability on G Selection cost $S: G \rightarrow R^+$

Improved model (S. Evans, K. Wachter, and DS): Mutation space M Mutation rate $v = \sigma$ -finite measure on M Genotype space G = {countable integer measures on M} State of system P = probability on G Selection cost $S: G \rightarrow R^+$ Evolution equation: $\frac{d}{dt}P_tF = P_t\left(\int \left[F(\cdot + \delta_m) - F(\cdot)\right]d\nu(m)\right)$

 $-P_t(FS) + (P_tF)(P_tS)$

In this case, the solution is unique.

General solution by Feynman-Kac: Let X_{t} be a Poisson point process with intensity v. Then

$$P_t F = \frac{\mathbb{E}\left[\exp\left(-\int_0^t S(X_u) \, du\right) F(X_t)\right]}{\mathbb{E}\left[\exp\left(-\int_0^t S(X_u) \, du\right)\right]}$$

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When S is linear ("non-epistatic"), the solution reduces to a Poisson random measure with intensity $\frac{1 - e^{-S(m)t}}{S(m)} d\nu(m).$

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What does this tell us?

1. Series expansion for P_t and limiting distribution: Let $Y_1, Y_2, ..., Y_n$ be an increasing random choice of n mutations (from distribution v.) Then

$$\lim_{t \to \infty} P_t F = \frac{\sum_{n=0}^{\infty} \nu(\mathcal{M})^n \mathbb{E}\left[\left(S(Y_1) \dots S(Y_n)\right)^{-1} F(Y_n)\right]}{\sum_{n=0}^{\infty} \nu(\mathcal{M})^n \mathbb{E}\left[\left(S(Y_1) \dots S(Y_n)\right)^{-1}\right]}$$

There is a corresponding finite-time formula.

What does this tell us?

2. Explosion: If B is a set s.t. S(g+b)-S(g) < v(B)when $b \in B$, then the number of mutations in B goes to infinity.

Implies "wall of death" rather than Gompertz.

Recombination



Barton-Turelli model

Recombination: Pick a random subset of mutations A from a distribution r. New genotype gets A mutations from one parent, and A^c mutations from the other.

If we iterate this process, the genotypes get completely reshuffled.

End up with a Poisson random measure, with the same marginal intensities as the genotype distribution we start with. Definition: The <u>recombination measure</u> R is the distribution on subsets of M, defining which sites come from the same parent. R is <u>shattering</u> if there is a positive constant α such that $E[\nu(A \cap R)^2] \leq \frac{1}{2}\nu(A)^2 - \alpha\nu(A)^3$.

Definition: A distribution P on genotypes is <u>dispersive</u> if there is a constant β such that for any Borel set A,

 $\int g(A) \mathbf{1}_{\{g(A) \ge 2\}} dP(g) \le \beta \mu P(A)^2.$

Recombination Operator $\Re P[F] = \int \int \int \int F(g_1 \mid R + g_2 \mid R^c) dP(g_1) dP(g_2) d\Re(R)$ Mutation operator; suppose $F(g)=e^{-g[f]}$ $\mathfrak{M}P[F] = P\left[F \cdot e^{\nu(e^{-f}-1)/n}\right];$ Selection operator: $\mathfrak{S}P[F] = \frac{\int e^{-S(g)/n} F(g) dP(g)}{\int e^{-S(g)/n} dP(g)}.$ Poissonization operator: $\mathfrak{P}[F] = \exp\left\{\int (e^{-f(m)} - 1)d\mu P(m)\right\}$ Easy part: Repeated recombination without mutation or selection (or linear selection) converges to Poisson distribution.

Theorem: If P is dispersive and R is shattering, then $\|\Re^k P - \Re P\|_{Was}$ $\leq (3\beta + 2) (|\nu|^2 \vee 2\alpha |\nu|) (k+1)^{-1}$. This is a process version of Le Cam's Theorem on convergence to Poisson distribution.

This justifies defining a dynamical system concentrated only on Poisson random measures.

Since mutation and selection are much slower, this converges to a process that is always Poisson.

Let $s_P(m)$ be the average cost of mutations m, averaged over the genotype dist. P.

If P is Poisson, then $s_P(m) := \int [S(g + \delta_m) - S(g)] dP(g).$

Let p_{t} be the Poisson intensity at time t.

$\frac{d\rho_t}{dt} = \nu - s_{P_t}(m)\rho_t.$

Theorem (Evans, DS, Wachter): If v is finite, this equation has a unique solution, which remains finite for all t.

Does this poissonization really work?



Main result Let $Q_k := (\mathfrak{RMS})^k P_0$ $Q'_k := (\mathfrak{RMS})^k P_0$ If the initial P_0 is Poisson and R is shattering, then for any positive T, $\lim_{n \to \infty} \sup_{t \le T} \|\Pi_{\rho_t} - Q_{\lfloor tn \rfloor}\|_{Was} = 0.$

 Π_{ρ} is the Poisson measure with intensity ρ .

Main idea

 $\left\|Q_k - Q'_k\right\|_{\text{Was}} \le \left\|Q_k - \mathfrak{P}Q_k\right\|_{\text{Was}} + 4\left\|\mu Q_k - \mu Q'_k\right\|_{\text{Was}}$

$$a_{k} = \left\| Q_{k} - \mathfrak{P}Q_{k} \right\|_{\text{Was}}$$
$$b_{k} = \left\| \mu Q_{k} - \mu Q_{k}' \right\|_{\text{Was}}$$

$$b_{k+1} \le e^{\sigma/n} \left(b_k + \frac{2\sigma}{n} a_k + \frac{2\sigma^2}{n^2} \right)$$

Thus, if we can show that a_k stays on order 1/n, the same will be true for b_k .

 $\left\|Q_k - \mathfrak{P}Q_k\right\|_{\mathrm{Was}}$

 $\leq \frac{C}{n} \sum_{i=0}^{k-1} \int d\mathcal{R}_k(\mathcal{A}) \int \left| \hat{S}'_{Q_i}(g) - \hat{S}_{Q_i^*, \mathcal{A}_{k-i}}(g) \right| dP_i(g)$

where $\hat{S}_{Q,\mathcal{A}}(g) = -n \sum_{i=1}^{K} \left(\log Q \left[e^{-S(X)/n} \mid X_{A_i} = g_{A_i} \right] - \right)$

 $-\log Q\left[e^{-S(X)/n}\right]$

Example: Brownian Excursion model



Limit mortality rates



Age