The evolution of senescence through decelerating selection for system reliability

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Keywords:

ageing; mutation–selection balance; quasispecies; redundancy; reliability; replicator dynamics; senescence.

Abstract

Senescence is a universal phenomenon in organisms, characterized by increasing mortality and decreasing fecundity with advancing chronological age. Most proximate agents of senescence, such as reactive oxygen species and UV radiation, are thought to operate by causing a gradual build-up of bodily damage. Yet most current evolutionary theories of senescence emphasize the deleterious effects of functioning genes in late life, leaving a gap between proximate and ultimate explanations. Here, we present an evolutionary model of senescence based on reliability theory, in which beneficial genes or gene products gradually get damaged and thereby fail, rather than actively cause harm. Specifically, the model allows organisms to evolve multiple redundant copies of a gene product (or gene) that performs a vital function, assuming that organisms can avoid condition-dependent death so long as at least one copy remains undamaged. We show that organisms with low levels of extrinsic mortality, and high levels of genetic damage, tend to evolve high levels of redundancy, and that mutation-selection balance results in a stable population distribution of the number of redundant elements. In contrast to previous evolutionary models of senescence, the mortality curves that emerge from such populations match empirical senescence patterns in three key respects: they exhibit: (1) an initially low, but rapidly increasing mortality rate at young ages, (2) a plateau in mortality at advanced ages and (3) 'mortality compensation', whereby the height of the mortality plateau is independent of the environmental conditions under which different populations evolved.

Introduction

Senescence is a universal phenomenon in organisms, characterized by increasing mortality and decreasing fecundity with advancing chronological age (e.g. Bonduriansky & Brassil, 2002; see Hughes & Reynolds, 2005; Bonsall, 2006; Williams *et al.*, 2006; Ackermann & Pletcher, 2007; Monaghan *et al.*, 2008 for recent general reviews). The ubiquity of senescence is a puzzle in evolutionary biology, because all else being equal, individuals that forgo senescence should have a selective advantage over those that senesce. Traditionally, senescence has been thought to arise as a consequence of

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Tel.: +1 613 520 2600 extn 3866; fax: +1 613 520 3539; e-mail: rlaird@connect.carleton.ca genes with late-acting deleterious effects, which persist over generations in organisms' genomes because there is little selection to purge them ('mutation accumulation' theory; Medawar, 1946, 1952), and/or because they have earlier acting benefits ('antagonistic pleiotropy' theory; Williams, 1957). These theories now have a firm theoretical foundation (Hamilton, 1966; Charlesworth, 1994), and many of their underlying assumptions have found widespread support. For example, laboratory selection experiments on fruit flies (Drosophila spp.) have repeatedly shown negative genetic correlations between early and late fecundity (Rose, 1991). Likewise, in an intensively studied population of wild mute swans (Cygnus olor) individuals that started their reproductive lives early also tended to end their reproductive lives early and such traits were heritable, indicating that genetic trade-offs can help shape reproductive senescence (Charmantier et al., 2006).

Nevertheless, in general, attempts to identify specific genes with temporal antagonistic pleiotropic effects have met with mixed success (Kirkwood, 2005; Leroi et al., 2005; Flatt & Promislow, 2007). Furthermore, through their emphasis on the deleterious effects of functioning genes, the above theories place genetics, rather than environmental damage, as the primary driver of senescence. Here we quantitatively examine the implications of an alternative perspective, arguing that the age dependency of gene action can arise not only because genes themselves produce deleterious effects, but also because they or their products can get damaged, and therefore eventually fail to act in an advantageous way. Gerontologists have identified a host of candidate agents capable of generating such damage, ranging from intrinsically generated metabolic by-products, such as reactive oxygen species, to extrinsic agents such as solar radiation (Arking, 1998; Pletcher et al., 2007). We therefore investigate the possibility that senescence can arise because accumulated damage becomes so great that it eventually impairs the transcription of beneficial genes (or destroys their beneficial products), rather than as a simple consequence of functioning genes with late-acting deleterious effects.

Nevertheless, one might wonder why organisms do not evolve genetic systems that are less vulnerable (or indeed invulnerable) to environmental damage. One possibility is that the underlying vulnerability is an unavoidable consequence of an optimal resource allocation strategy, reflecting the price an organism is prepared to pay to enhance its reproduction ('disposable soma' theory; Kirkwood, 1977, 1997; Kirkwood & Holliday, 1979; see also Abrams & Ludwig, 1995; Mangel, 2001). Here we argue that adaptations to reduce the vulnerability of the soma to damage will only be as good as they need to be, such that there will be little selection to allow organisms to respond to the types of damage that would occur far beyond their typical lifetimes, even if such a response were entirely cost free. Therefore, a trade-off between repair and reproduction is not necessary for senescence, even if such trade-offs occur.

One of the most natural ways to reduce genomic vulnerability is to evolve multiple copies of the same essential gene (or gene product) that can act as back-ups should any one of them fail or become damaged (Clark, 1994; Nowak et al., 1997; Conant & Wagner, 2003; Kafri et al., 2006). The work of Gavrilov & Gavrilova (2001, 2006), falling under the general heading of 'reliability theory' (Barlow et al., 1965) has adopted this perspective by taking an engineering approach to understand how biological systems with irreplaceable redundant components can exhibit increased failure rates, i.e. actuarial senescence, as they age. However, the built in redundancy in their models provides a starting point for their theory rather than an end point, and it has been criticized for not being evolutionarily based (Pletcher & Curtsinger, 1998; Pletcher & Neuhauser, 2000). Using a quasispecies model of evolution, we show how a degree of redundancy (and more broadly an ability to deal with damage to system components) can evolve by natural selection, and that the resulting population equilibrium is sufficiently diverse to generate mortality trajectories with attributes that are observed in natural populations, but are not as readily understood by the late-acting deleterious effects of functioning genes.

The model

Following Gavrilov & Gavrilova (2001), we assume that a particular vital function of an organism can be represented as a system of elements that are redundant, mutually substitutable and irreplaceable when damaged (i.e. they are in 'parallel'). We envision these redundant elements as gene products whose number is heritable at a single locus, although our model could also be applied (with appropriate modifications) to a multi-locus system treating the elements as genes themselves. The elements are subject to random failure due to damage at a constant, independent rate k, and organisms can only avoid condition-dependent death so long as they have at least one remaining undamaged element. In addition to 'intrinsic' condition-dependent mortality caused by the extinction of undamaged elements, we also assume a constant 'extrinsic' age- and condition-independent mortality rate of q, such that the expected cumulative survivorship at time t for a monotypic population of individuals with *n* redundant elements is

$$l(t) = (e^{-qt})(1 - (1 - e^{-kt})^n).$$
(1)

The expected survivorship of a mixed-n population is the average of these survival probabilities weighted by the relative abundances of the genotypes that determine individuals' n values.

Greater redundancy leads to greater survivorship, and, assuming a constant birth rate, individuals with greater nhave greater lifetime reproductive output (Fig. 1). Thus, insofar as lifetime reproductive output (R) is related to fitness, (i.e. in populations with discrete generations), there is directional selection for redundancy (an analysis demonstrating that our results are analogous when generations continuously overlap, and fitness is measured by the intrinsic rate of natural increase, is provided in Appendix S1). However, this directional selection operates in a decelerating fashion: the marginal increase in R of adding an additional element is greater in individuals with low n compared with individuals with high *n* (Fig. 1). Therefore, under the realistic assumption that most non-neutral mutations are deleterious (Eyre-Walker & Keightley, 2007), we hypothesize that selection will eventually be balanced by mutation, resulting in populations that evolve towards an equilibrium distribution of genotypes. Given that R is dependent not only on *n*, but also on the failure and extrinsic mortality rates (Fig. 1), exactly where the mutation-selection balance is



Fig. 1 Diminishing value of redundancy in parallel systems. In systems whose elements are redundant, irreplaceable and heritable, there is positive, directional, yet decelerating selection for redundancy (*n*), whether fitness is measured in terms of *R*, lifetime reproductive output (a,b) or *r*, intrinsic rate of natural increase (see Appendix S1). The asymptotic relationship between *R* and *n* is influenced by both *k*, the failure rate of each element, and *q*, the condition- and age-independent (extrinsic) mortality rate. (a) k = 0.01; (b) k = 0.02. In both cases we assumed a constant age-independent birth rate of b = 2, although this simply acts as a scalar. Although birth rate often trades off with survivorship, we avoided such complexities so that senescence would not be built into our model through pleiotropy.

struck should depend critically on k and q, as well as on the relative rates of mutations that increase and decrease redundancy.

We modelled the evolution of redundancy using a discrete-generation version of the quasispecies equation (Nowak, 2006), which tracks the relative abundances of *N* different genotypes over many generations. 'Genotype 1' corresponds to individuals with n = 1 element, and so on. The discrete quasispecies is characterized by a system of simultaneous recursion equations given by:

$$x'_{i} = \frac{\sum_{j=1}^{N} x_{j} f_{j} \mu_{ji}}{\sum_{i=1}^{N} \sum_{j=1}^{N} x_{j} f_{j} \mu_{ji}}, \quad i = 1, 2, \dots, N$$
(2)

where x'_i is the relative abundance of genotype *i* in the next generation, x_i is the relative abundance of genotype

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j in the current generation, f_i is the reproductive success of genotype j and μ_{ji} is the transition rate between genotype i and genotype i (i.e. the mutation rate when $i \neq j$). Befitting populations with discrete generations, we used lifetime reproductive output $(R = \int_0^{\tau} b(t) l(t) dt)$ as a proxy for *f*, assuming a constant birth rate of b(t) = b, which acts simply as a scalar. We set τ to 10⁶ to ensure that the maximum length of the reproductive season is finite, but in reality the vast majority of individuals will have died long before this time is reached. In our model, mutant offspring that inherit a different element number than their parents only differ by one element (e.g. an individual with three elements can potentially have offspring with three, two or four redundant elements). We also assume that all 'up-mutations' (mutations that increase *n* by one) are equally likely and occur at the rate α , and similarly, that all 'down-mutations' (mutations that decrease *n* by one) are equally likely and occur at the rate β ($\beta > \alpha$). Thus, the transition rate (μ) in equation 2 is given by α when i = j + 1, β when i = j - 1, $1 - \alpha$ when i = j = 1, $1 - \beta$ when i = j = N, $1 - \alpha - \beta$ when 1 < i = j < N and 0 otherwise $(\alpha + \beta \le 1)$. Aside from rare mutations, offspring begin life with the same *n* value as their parent; only the genotype specifying redundancy is inherited, not damage itself.

Results and discussion

To investigate the evolution of redundancy under different levels of k and q, we started with populations with no redundancy (n = 1) and modelled the evolution of the relative abundance distribution of genotypes using the quasispecies equation. Figure 2 shows two example evolutionary outcomes of this analysis at two levels of extrinsic mortality q. Early on, there is a fast turnover of genotypes (Fig. 2a-d) as the mean level of redundancy evolves (Fig. 2e and f). However, over successive generations, this turnover slows and eventually ceases, whereupon the relative abundance distribution of the genotypes remains constant (Fig. 2g and h). Eigenvector analysis allows us to identify this equilibrium distribution and confirms that the equilibrium is stable (Appendix S2). Thus, redundancy evolves but only to a point; there is no selection for intrinsic immortality through infinite *n*. Note that this is true even if redundancy is cost-free, as in our model; however, including costs would clearly limit the evolution of redundancy even further.

Environmental conditions can greatly affect the equilibrium distribution and the mean evolved value of *n* (Fig. 3a). For example, far greater redundancy evolves under relatively low extrinsic mortality (q = 0.02; Fig. 2a, c, e and g) than under relatively high extrinsic mortality (q = 0.20; Fig. 2b, d, f and h). Likewise, greater levels of redundancy evolve when elements are intrinsically likely to get damaged (high k). In general therefore, individuals only inherit the level of



Fig. 2 Quasispecies evolution. (a,b) Example evolutionary trajectories of the relative abundances over 30 000 generations of 50 different genotypes (levels of redundancy) in a large population where lines correspond to individuals with different numbers of parallel elements (n = 1-50). Here our maximum of N = 50 elements was set sufficiently high to allow the distribution of n at equilibrium to be effectively independent of N. A failure rate of k = 0.01 and a birth rate of b = 2 was assumed in all cases. Trajectories under two different extrinsic mortality regimes are shown: (a) q = 0.02 and (b) q = 0.20 (all panels in the same column have these same parameter values and represent the output from the same numerical analysis). Panels (c) and (d) show details (i.e. the first and last 1000 generations) of (a) and (b) respectively; the identities of several genotypes are given. To help distinguish between lines in (a-d), a colour version of this figure is available online. At the start (generation 0), all individuals have n = 1 element. Evolution then proceeds according to the discrete quasispecies equation, using lifetime reproductive output (R) as a measure of fitness, and mutation parameters of $\alpha = 0.001$ (up-mutation rate) and $\beta = 0.01$ (down-mutation rate). (e,f) The evolutionary trajectories of mean n in the population. Eventually, the decelerating fitness functions results in mean n reaching an asymptote that is strongly dependent on q. This equilibrium value is independent of initial genotype relative abundances (confirmed by analyses starting with monocultures of n = 50, not shown – see also Appendix S2). (g,h) At equilibrium, there is a stable distribution of relative abundances (relative abundances shown for generations 29 900 and 30 000).

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Fig. 3 Redundancy and longevity in different environments. (a) The mean number of elements at equilibrium (mean *n*) as a function of element failure rate (*k*) and extrinsic mortality (*q*). (b) The mean longevity in captivity (i.e. when there is no extrinsic mortality) for populations that originally evolved under different combinations of *k* and *q*. Other parameter values: $\alpha = 0.001$, $\beta = 0.01$, b = 2.

redundancy that is likely to be positively advantageous in their lifetimes under the prevailing environmental conditions.

This environmental dependence of evolved redundancy leads to differences in the average longevity of individuals from populations that evolve under different values of k and q. These differences remain even when the population, previously subject to selection, is placed into 'captivity', with zero extrinsic mortality, thereby matching patterns that are frequently observed in natural and experimental populations (e.g. Keller & Genoud, 1997; Stearns et al., 2000; Carlson et al., 2007 and papers cited therein; but see Abrams, 1993; Williams & Day, 2003; Reznick et al., 2004). Thus, individuals from populations that originally evolved under relatively high extrinsic mortality have a shorter mean longevity in captivity compared with individuals from populations that evolved under relatively low extrinsic mortality (Williams, 1957; Fig. 3b). Although increasing k results in the evolution of greater redundancy (Fig. 3a), individuals from high-*k* populations still have a shorter mean longevity than individuals from low-*k* populations due to under-compensation for the direct effect of damage (Fig. 3b).

In our model, senescence evolves from nonsenescing ancestral populations. At the start of the evolutionary process, when populations are composed of individuals with no redundancy, cumulative survivorship is described by a simple exponential decay (Fig. 4a and b), and mortality is constant with age (Fig. 4c and d). However, the stable mixed-*n* populations that evolve due to decelerating selection for reliability show increasing mortality with age, i.e. actuarial senescence. More specifically, the senescence patterns exhibited by our model populations match those of natural populations in three key respects (Gavrilov & Gavrilova, 2001): First, they have an initially low, but near-exponentially increasing mortality rate. Second, like natural and experimental populations (Carey et al., 1992; Curtsinger et al., 1992; Pletcher & Curtsinger, 1998), our model populations exhibit a waning mortality rate at old ages, culminating in a mortality plateau in the 'oldest old' (Fig. 4c and d). This plateau is not directly predicted by the classical evolutionary theories (i.e. the 'mutation accumulation' and 'antagonistic pleiotropy' theories) and can only be recovered (e.g. Mueller & Rose, 1996) with difficulty (Pletcher & Curtsinger, 1998; Wachter, 1999). Third, our model populations show 'compensatory mortality', in which the height of the mortality plateau is related only to the failure rate, and not to the extrinsic mortality under which the population evolved (Fig. 4c and d). This matches data from real populations whose mortality rates converge in the oldest age classes (Gavrilov & Gavrilova, 1991) and is a feature in common with related Markov mortality models (Steinsaltz & Evans, 2004). Finally, Gavrilov & Gavrilova (2001) argued that realistic early-life (Gompertzian) mortality was only possible in populations of organisms with redundant components if there was a distribution of values of n, rather than a monoculture (see Appendix S3 for further discussion and analysis). In the absence of an evolutionary framework, it was suggested that the variation could arise if organisms are born with varying levels of realized n due to a high incidence of initial defects (Gavrilov & Gavrilova, 2001), an idea that has met with resistance (Pletcher & Neuhauser, 2000). Here, we show that this initial defects hypothesis is not needed to have variation in *n*; rather, the necessary variation can be maintained at the population level by mutation-selection balance.

Our model assumes random damage to redundant gene products and one could readily apply the same type of model to consider damage to genes themselves; indeed many previous models of ageing have assumed random damage to genes (e.g. Szilard, 1959). Pletcher *et al.* (2002) found no support for global (whole organism) increases in gene disregulation with advancing age in *Drosophila* and neither did Rogina *et al.* (1998) when screening a more limited array of genes. However, as



Fig. 4 Evolution of senescence. (a,b) Examples of cumulative population survivorship and (c,d) instantaneous mortality curves based on relative abundance distributions of the number of elements (*n*) before quasispecies evolution (when all individuals had n = 1; solid lines) and after quasispecies evolution (broken lines). All curves represent survivorship and mortality 'in captivity'; i.e. when there is no extrinsic mortality. However, the broken lines represent the extrinsic mortality conditions in which the populations originally evolved for 30 000 generations: dotted line (black), q = 0.02; short-dashed line (red), q = 0.10; long-dashed line (blue), q = 0.20; a colour version of this figure is available online. In (a) and (c), there was a failure rate of k = 0.01; in (b) and (d), k = 0.02; in both cases, the birth rate was b = 2.

Pletcher et al. (2002) note, if stochastic disregulation occurs differently in different cells, then it would be difficult to detect such changes through a whole-organism analysis (in other words, if different cells fail to express different genes due to damage, then one would be less likely to find consistent increases in the variance of expression of any given gene over the whole organism). Direct evidence for increased cell-to-cell variation in gene expression was recently provided by Bahar et al. (2006) who reported increased heterogeneity in gene expression among cells in ageing mouse hearts. Moreover, recent work by Somel et al. (2006) has reported an age-correlated increase in heterogeneity of gene expression (ACHE) in both rats and humans. Both of these studies highlight the plausibility of age-dependent failure of gene function arising through stochastic damage (see also de Grey, 2007).

The idea that there is little selection to allow organisms to respond to damage far beyond their typical lifetimes has had a long history in evolutionary thought (Comfort, 1979). Likewise, it has long been appreciated that genetic redundancy will evolve to make somatic genomes more robust to environmental damage (Nowak et al., 1997; Wagner, 1999). Redundancy may also play a role in 'canalization' (Waddington, 1942), that is, the buffering of developmental pathways against mutational or environmental perturbations (Kitano, 2004; Hansen, 2006). Here we have explicitly linked these phenomena, by developing and exploring a formal evolutionary model for senescence using a quasispecies model of redundancy. As Bonsall (2006, p. 130) recently noted, 'developing a population genetic framework to explore how genome size and gene duplications might affect the patterns and predictions on longevity evolution will refine the evolutionary theory of ageing'.

Our general result can be made by analogy: homeowners who have experienced blackouts may have a back-up generator in case the electricity fails. However, almost no homeowner would consider having a 'back-up for the back-up' because such bad luck rarely arises. In this way, only a finite number of contingencies evolve in natural organisms to sustain it simply because the likelihood of additional back-ups being needed is increasingly remote. Multi-stage cancers acting late life can arise for much the same reason, when a series of checks and balances preventing cell proliferation within a typical lifespan can by chance all eventually become damaged, and the disease spreads (Armitage & Doll, 1954; Nunney, 1999, 2003; Campisi, 2003; Frank, 2004, 2007). Indeed, there are now a number of biological examples of death or severe impairment arising as part of a stochastic multistage process in which key genes become damaged by somatic mutation. For example, Frank (2005) compared the age-specific incidences of inherited and sporadic forms of retinoblastoma and showed how the dynamics of these cancers were consistent with a simple multistage process of somatic mutations. In bilateral retinoblastomas, tumours develop in both eyes as a result of an inherited predisposition to tumour formation. By contrast, unilateral cases arise in one eve and are thought to occur sporadically. Both patterns of age onset can be readily understood if one assumes that these particular cancers arise as a two stage process, with the first mutation inherited in bilateral retinoblastoma subjects.

Note that in our model for the evolution of senescence, the time-dependent deleterious effects arise not through the late-life action of functioning genes as typically assumed (see Penna, 1995 for a rather extreme example of a model with time dependency built into the genes themselves) but through damage-based late-life inaction of beneficial genes/gene products. As any evolved protective mechanisms are always subject to some form of damage themselves, such damage is logically inevitable. Interestingly, Ackermann *et al.* (2007) also developed a 'damage-centric' evolutionary model of senescence. Although both models demonstrate how environmental

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damage can lead to senescence arising from nonsenescing ancestral populations, there are several key differences between their model and ours. Ackermann et al.'s (2007) contribution was intended to explain the evolutionary origin of senescence in single celled organisms such as prokaryotes. Appropriately in this single celled context, there is no separation of soma and germ line; so, environmental damage accrued by a cell is passed on during cell division. In this case, senescence can readily arise due to the evolved asymmetric partitioning of damage between the products of cell division, effectively leading to an increasingly damaged and death-prone 'parent' and a pristine 'offspring'. By contrast, in our model only the genotype governing redundancy is inherited (subject to mutation), not damage itself. Therefore, our model is more appropriate in multicellular organisms where damage to somatic cells need not be inherited.

Through its emphasis on damage, our model also shares many assumptions with the disposable soma theory (Kirkwood, 1977; Kirkwood & Holliday, 1979), one of the key recent advances in the development of an evolutionary understanding of senescence. However, the disposable soma theory assumes a trade-off between reproduction and repair. In the system we have modelled, senescence readily evolves without the need to invoke such a trade-off. The disposable soma model has been characterized as an example of pleiotropy which emphasizes damage, such that a gene diverting energy to reproduction has the antagonistic pleiotropic effect of reducing damage repair (Kirkwood & Austad, 2000). By the same token our model might be taken to represent an example of the mutation accumulation theory, this time emphasizing accumulated damage to vital elements rather than the late-acting deleterious effects of functioning genes. Of course in both cases, selection to counter late-life gene activity or inactivity will be relatively weak, but the underlying mechanism giving rise to senescence (failure to do good vs. active harm) is fundamentally different, as is the evolutionary response. As noted earlier, there may well be selection against redundancy (anti-redundancy) if redundant elements are costly (Krakauer & Plotkin, 2002). Whether or not measures to protect the soma from environmental damage incur a cost, and whether or not these costs are traded against reproduction, it is clear that senescence will still arise due to the eventual degeneration of redundant systems that perform vital functions.

Acknowledgments

We thank the Natural Sciences and Engineering Research Council (Canada), the Ontario Innovation Trust and the Canada Foundation for Innovation for funding. Our referees and associate editor provided a number of very helpful comments, including one that motivated Appendix S2.

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Supporting information

Additional Supporting Information may be found in the online version of this article:

Appendix S1 Discussion of a continuously overlappinggeneration version of the model.

Appendix S2 Eigenvector analysis of the nature and stability of the equilibrium.

Appendix S3 Discussion of the importance of distributions of *n*.

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Received 8 October 2008; revised 9 January 2009; accepted 12 January 2009