The adaptive function of sexual reproduction: a lottery analogy.

Donal A. Hickey

Department of Biology, Concordia University

7141 Sherbrooke West,

Montreal, Quebec H4B 1R6

Canada

and

G. Brian Golding

Department of Biology, McMaster University

1280 Main St. West,

Hamilton, Ontario L8S 4K1

Canada

Corresponding author: Donal A. Hickey, Department of Biology,

Concordia University, 7141 Sherbrooke West,

Montreal, Quebec H4B 1R6, Canada.

E-mail: donal.hickey@concordia.ca

Abstract.

We use a lottery analogy to show how sexual reproduction is advantageous in populations that contain abundant genetic variation. Since it has been shown that most eukaryotic species are genetically polymorphic, our model can explain the ubiquity of sex among such species. The model also indicates that classic population genetics theory is applicable to ecological studies of natural selection acting on standing genetic variation.

Introduction.

The function of sexual reproduction has been the subject of much debate among biologists (see Otto 2009, Colegrave 2012, for recent reviews). Here, we use a lottery analogy to illustrate the effects of sexual reproduction in a finite population where many genes are undergoing selection. An example of this situation would be where adaptation is based on the standing genetic variation in a local population (Barrett and Schluter 2007, Burke et al 2010, Kosheleva and Desai 2017, McDonald et al 2016, Teotonio et al 2009).

Biologists are well aware that Mendelian genetics in an outbreeding sexual population is essentially a game of chance. Indeed, Mendelian inheritance has been compared to a lottery (Williams 1975, Maynard Smith 1978). In this study, we revisit the lottery analogy in order to explain the biological function of genetic recombination in a sexually reproducing population. We point out that in the case of inheritance, the lottery is biased by selectively-induced, heritable changes in the frequencies of individual genetic variants. We argue that it is the interaction between random recombination and deterministic natural selection which allows sexual populations to evolve much more efficiently than asexual populations. This provides a consistent selective advantage for sexual reproduction.

Williams (1975) was the first to use a lottery analogy for sexual reproduction. He suggested that the production of genetically variable offspring as a result of sexual outbreeding could lead to the production of a "winning" genotype that was especially well adapted to the environment. For such a system to be successful, however, an individual sexual parent would need to produce a very large number of offspring in order to ensure that the rare lucky winner would be included among its offspring. This does not fit with the observation that many sexual species produce relatively few offspring. In addition, Maynard Smith (1978) pointed out that, in a real lottery, changing the number on one's ticket does not increase one's chance of winning. Based on these previous studies, one might conclude that the lottery analogy is not useful when trying to understand Mendelian inheritance and sexual reproduction. But the genetic lottery is special in a number of ways, and by taking these special features into account we can better understand its function.

The first feature to be taken into account is that the winning combination, or optimal genotype, does not change drastically and unpredictably from one generation to the next.

Environments do change, but this change usually happens gradually over many

generations. Thus, the current environment is a reasonable estimator of environmental

conditions in the following generations. The second point to consider is that the number of

possible genotypic combinations can be many orders of magnitude larger than the

population size (see discussion below). This means that the chance that even a single

individual within the entire population will have the optimal genotype is extremely remote.

The third point is that both genetic lotteries and many conventional lotteries can have

partial winners even in the absence of an overall jackpot winner. In both cases there is an

advantage in having at least some of the winning numbers. Finally, the crucial difference

between a conventional lottery and the genetic lottery is that inheritance provides an

informational feedback each generation regarding the "winning" genotypic combination.

We explain this point in more detail below.

87   **The model**.

Students of genetics are familiar with the process of generating various genotypic

combinations of alleles at two, three or four variable loci. But we rarely stop to think how

this plays out at the genomic level. Eukaryotic genomes are estimated to contain

approximately 20,000 genetic loci and many of these loci are genetically polymorphic

(Lewontin and Hubby 1966). If we take the overly conservative estimate that only 1% of

the gene loci within the genome are genetically variable, we are still left with 200 genes. If

we make a further conservative assumption that none of the genes has more than two allelic

variants, we can calculate that there are 2^{200} possible genotypic combinations. This number

is larger than 10^{60} which in turn, is several orders of magnitude larger than the estimated

number of atoms in the solar system. Obviously, no biological population is large enough

to contain even a single individual representing each of these combinations. In fact, real

populations, because of their finite size, contain only a tiny fraction of all possible

genotypic combinations.

The relationship between the number of genetically variable genes and the total

number of possible genotypic combinations was first noted by East (1918). He pointed out

that ten variable genes could generate 1,024 different genotypes and that twenty variable

genes could generate 1,032,576 genotypic combinations. Here, we extend this calculation

up to 200 genes. The relationship between the number of variable genes and the

corresponding number of genotypes is shown in Figure 1. From the figure it can be seen

that once we reach more than thirty genetic loci, the number of possible genetic

combinations already exceeds most real population sizes, especially those of macroscopic

plants and animals. For example, 30 biallelic loci can generate more than one billion

different genotypes. The number of genotypes corresponding to 100 loci is approximately

10^{30}, which is larger than the number of atoms in the solar system; the number

corresponding to 200 loci is many orders of magnitude larger than this again.

Figure 1. Relationship between number of genetically variable genes and the number of

possible genotypic combinations.

The graph shows the results for up to 200 biallelic loci. The Y axis is on a log scale.

Using the lottery analogy, we can think of an individual genotype containing 200

variable genes as a "ticket" with a list of 200 numbers. In the simple case where we consider

only two variants per gene, we can represent the variants as a series of "zeros" and "ones",

where zero represents the more common allelic variant and the number one represents a

rarer advantageous variant. Again, for simplification let's assume that the initial frequency

of the advantageous variant at each genetic locus is 0.1 or ten percent. If the tickets are

chosen randomly there is a ten percent chance of observing a "1" at any one of the 200

positions. A lottery jackpot winner would have a "1" at all two hundred positions. But the

chance of finding such a ticket in the initial population is only 1 out of 10^{200}. In other words,

we would need to have a number of tickets that is many orders of magnitude larger than

the number of atoms in the observable universe in order to have a reasonable chance of

observing one such ticket. This means that, in practice, such a combination would not be

observed. In fact, all of the tickets would have relatively few ones and many zeros. For any

given ticket, we expected to see an average of 20 ones and 180 zeros; this expectation is

based on the initial frequencies of ones and zeros. But if the numbers are randomly assigned

based on these frequencies, not every ticket will have exactly 20 ones. The numbers will

be binomially distributed around the average of 20 and the majority of the values will fall

between 12 and 28. This means that there is not only an essentially zero chance of observing

a ticket with 200 ones (the jackpot winner), there is also virtually zero chance of observing

a ticket with even half that number of ones. So, at first glace, this genetic lottery seems

entirely hopeless.

But, as stated above, the genetic lottery is special in that there is a differential

survival of tickets depending on their genetic fitness, i.e., the number of "ones" on the

ticket. This means that, after selection, tickets containing a higher number of ones will be

more represented than those tickets containing less ones. This is the process of natural

selection. But natural selection alone can only result in a population containing tickets with

the highest number of ones that already exist in the initial population. In our example, this

would be about 30 out of the maximum of 200. But if the rounds of selection alternate with

rounds of sexual outbreeding and recombination, we observe a further effect. Specifically,

as the frequency of "ones" increases due to selection, recombination will randomly

recombine them to former a higher average number of "ones" per ticket. Thus, the power

of random recombination lies in its ability to adjust the number of "ones" per ticket to

match the current frequencies at individual positions. For example, when the frequency of

"ones" reaches 0.15, then the average number per ticket will be 30 rather than the initial

value of 20. The relationship between the rising allele frequencies at each position and the

frequency of the "jackpot combination" (that contains a "one" at all 200 positions) is shown

in Figure 2. As can be seen from the figure, it is only toward the end of the process, that

the winning combination appears, where it then rises dramatically in frequency. This

pattern can be explained mathematically by saying that the frequency of the winning

combination is an extreme power function of the 200 individual frequencies.

Figure 2.

The relationship between the increase in the frequency of favorable alleles at

individual genetic loci (X axis) and the expected frequency of the optimal genotypic

combination.

As can been seen from the figure, the frequency of the optimal genotype stays close

to zero over most of the frequency range at the individual loci. This effect is most

pronounced for 200 gene loci (solid line) and less so for 20 loci (dashed line).

In successive rounds of a conventional lottery, new tickets are printed using the

same expected frequencies of numbers as in the previous round. But in the genetic lottery

these frequencies are modified based on the genetic composition of the selected parents.

For example, early in the process the frequency of ones at individual positions may have

risen from 0.1 to 0.105 due to selection. In this case random recombination will generate

new "tickets" with an average of 21 "ones" per ticket, a slight increase from the original

value of 20. As the process continues, both the frequency at individual positions and the

total number of ones per ticket will increase concomitantly until, eventually, all tickets will

contain the winning combination. In a conventional lottery, such a continual adjustment of

the frequencies would be considered a blatant case of cheating. But it is precisely this

"trick" that nature uses to arrive at a genotypic combination that appears to be

mathematically unattainable at the outset. This process is similar to the multiplicative

weights update algorithm, MWUA, that has been used as an optimisation method in game

theory and machine learning (Arora et al 2012, Chastain et al 2014). Specifically, random

recombination updates the distribution of "tickets" each generation based on the post-

selection frequencies of the zeros and ones at each of the 200 positions.

If we restate the problem in more formal genetic terms, we can consider the

"tickets" as genotypes and the zeros and ones as allelic variants. At the start of this process,

the frequency of the favorable allelic variant at each locus is 0.1. Consequently, the

probability of finding one individual with the favorable allele at every locus in the first

generation is only 10^{-200}. Although the prospect of finding an individual with the optimal

genetic combination (i.e., a favorable allele at all 200 loci) is essentially zero at the start of

the process, inheritance provides a feedback loop between generations that continuously

improves the odds. All genotypes in the population will have a relatively low fitness

initially, but natural selection will tend to favor "the best of the bad lot". These early rounds

of selection will result in incremental increases in the frequency of favourable alleles at

each of the 200 loci. Recombination will then generate new random combinations of these

alleles. And since the individual allele frequencies have increased slightly, the expected

frequency of genotypes with higher numbers of favorable alleles per chromosome will also

increase automatically. In this way, despite its random nature, recombination facilitates the

production of genotypic combinations that would be hopelessly improbable in its absence.

Discussion

The exponentially increasing number of genotypic combinations as the number of

genetically variable loci increases was first pointed out by East (1918). Subsequently, Iles

et al (2003) used this relationship to point out that multi-locus genotypes could be very rare

even in very large finite populations. Our focus here is on the situation where the number

of loci is of the order of 100 or greater. As illustrated in Figure 1, once the number of loci

under selection exceeds twenty or thirty, the number of possible genotypic combinations

becomes much greater than most biological population sizes. This means that natural

selection cannot act on the full range of genotypes. Rather it is limited to a narrow slice of

such genotypes in any given generation. It is tempting to think of natural selection as

always favoring the fittest possible genotype. But when many loci are under simultaneous

natural selection, the theoretically fittest genotype is often absent from the population.

Thus, selection cannot act directly on this genotype, although we tend to think of the

process in such teleological terms. In fact, the production of the optimal genotypic

combination is simply the automatic consequence of recurrent rounds of natural selection

and recombination. Most of the selection occurs among genotypes of varying degrees of

intermediate fitness. And the effects of recombination are purely random. Yet the

interaction between selection and random recombination provides an efficient mechanism

for the eventual production of the optimal genotype. The power of recombination is that it

allows a finite population to effectively resample genotypes from a virtual infinite

population with the current allele frequencies (Ewens 1972, Edhan et al 2017, Hickey and

Golding 2018). It is in this way that it produces higher fitness genotypes that were not

previously present in the population.

Our argument is based on the assumption that the frequency of any given genotypic

combination after a round of recombination can be estimated by multiplying the

frequencies at the individual loci. This assumption requires that approximate linkage

equilibrium is maintained during the course of the selection. Nagylaki (1993) showed that

this is true when the recombination fraction is equal to, or greater than the selection

coefficient. For example, two adjacent genes that are one centimorgan apart would remain in approximate linkage equilibrium if the selection coefficient were 0.01. Non-adjacent genes would maintain linkage equilibrium in the presence of higher intensities of selection. This explains the somewhat paradoxical situation that, whereas a given gene can remain in linkage disequilibrium with its nearest neighbors for many generations, it becomes randomized with regard to the majority of other genes rather quickly. Under such conditions, and when the fitness interactions between loci are multiplicative, the multiplicative weights update algorithm can be used (Arora et al 2012). Here, we point out that this process provides an efficient mechanism for the production of higher fitness genotypic combinations that were not previously present in the population.

Previous studies of recombination in finite populations have focused on the adjustment of existing genotype frequencies (Otto and Barton 2001, Iles et al 2003, Otto and Gerstein 2006). Here, our focus is not on the frequencies of existing genotypic combinations, but rather on the production of new genotypes that did not previously exist in the population. As fitter haplotypes increase in frequency, recombination can act to produce still fitter haplotypes (Iles et al 2003). Recombination enables the population to resample the universe of all possible genotypic combinations based on the current allele frequencies (Ewens 1972, Hickey and Golding 2018). Thus, a finite sexual population is not limited to selection among those genotypes that already exist within it. Previously, adaptive evolution based on selection at many genetic loci was seen as potentially very costly in terms of selective deaths (Haldane 1957). However, Haldane's calculations were based on a model of selection among fixed genotypes. Once we include the possibility of recurrent disassembly and reassembly of genotypes through random recombination, the problem envisaged by Haldane disappears (Hickey and Golding 2019).

It is worth noting that, according to our model, the production of the optimal genotypic combination is the result of an iterative process that occurs over many generations; it is not the result of a single "lucky toss" as envisaged by Williams (1975). This iterative process explains why sexual reproduction needs to occur continuously. Peck and Waxman (2000) wondered why intermittent sexual reproduction is not more common in nature and a number of other authors have sought explanations for obligate sex (Kleiman and Hadany 2015, Crouch 2017).

261   One of the earliest proposals for the advantage of sex was that it generates genetic

262 variants (Weissman 1887). While this is true, sexual reproduction does not usually increase

263 the level of variation relative to that in the previous generation. Rather, it replenishes the

264 genotypic variation that would have otherwise been eroded by selection and random

265 genetic drift. Even more important, it continually shifts the distribution of that variation

266 towards a greater average fitness, as we have shown above. Without sex and recombination,

267 the adaptive evolutionary process would be greatly impeded. Classic population genetics

268 studies (e.g. Haldane 1957) envisaged selection as performing and exhaustive search

269 among all possible genotypic combinations. As the number of combinations explodes in

270 size, however, such an exhaustive search becomes prohibitively difficult. But when we

271 include recurrent rounds of recombination, then natural selection performs an essentially

272 heuristic search that is much more efficient (Hickey and Golding 2018). Through

273 recombination, nature exploits its own form of the multiple weights update algorithm (see

274 Arora et al 2012, Chastain et al 2014). It does this by favoring the best available sub-

275 optimal genotypes and then recombining them. This solution removes the doubts that have

276 been expressed about the application of classic population genetics theory to adaptive

277 evolutionary change (see Messer et al 2016, Reznick 2016). Since recombination allows

278 selection to act independently at each locus, many genes can be selected simultaneously

279 without incurring a prohibitively large reproductive cost.

280   Our conclusion is that the adaptive function of sexual reproduction lies in its ability

281 to translate increasing allele frequencies at many individual loci into increasing numbers

282 of favorable alleles per chromosome. In the short term, natural selection acts on whole

283 genotypes but recombination then disassembles these selected genotypes and recombines

284 them into new, higher-fitness combinations. In the long term, this two-step iterative process

285 of selection and recombination can produce genotypes containing potentially thousands of

286 advantageous genetic variants. Without recombination, the efficient production of such

287 genotypes would be mathematically unattainable in a finite population. Looking at the

288 problem from another perspective, we could say that recombination is the process that

289 translates short-term genotypic selection into long-term genic evolution.

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