## By TAKEO MARUYAMA

subdivided population\*

## National Institute of Genetics, Mishima, Japan

## (Received 31 October 1969)

#### SUMMARY

Following Moran's (1962) method, it was shown that the fixation probability of a mutant gene is not altered by the subdivision of a population into partially isolated colonies, if the following conditions are met; fitness is additive, samplings and selection is done separately in each colony, and migration between colonies does not change the gene frequency in the whole population. This conclusion was checked by simulation experiments.

In evolutionary theory, and in animal and plant breeding, the fixation probability of genes plays a very important role. Kimura (1957 and 1962) has solved this problem for a randomly mating polpuation of finite size. He considers a locus with two alleles  $A_1$  and  $A_2$  segregating, and assumes that the relative fitnesses of the  $A_1A_1$ ,  $A_1A_2$  and  $A_2A_2$  genotypes are 1, 1+2hs and 1+2s respectively. If the initial frequency of  $A_2$  is p and the effective size of the population is N, Kimura has shown that the diffusion approximation to the ultimate fixation probability of allelle  $A_2$  is

$$U(p) = \frac{\int_{0}^{p} G(x) \, \mathrm{d}x}{\int_{0}^{1} G(x) \, \mathrm{d}x},$$
(1)

where  $G(x) = \exp[-4Ns(2h-1)x(1-x) - 4Nsx]$ .

Robertson (1960) used this fixation probability in his theory of selection limits. Kimura & Ohta (1969) used also this probability in the calculation of the time required for mutant genes to reach fixation. Hill & Robertson (1966) studied the fixation probability for two linked loci in a finite panmictic population. They investigated, in particular, the effect of one locus on the fixation probability of the other locus, and obtained interesting conclusions. Ohta (1968) also studied the problem for two linked loci, with special reference to the effect of initial linkage disequilibrium on the fixation probability. Kimura has solved the problem for a case of two independent loci with epistatic effects (see Ohta, 1968).

Since all natural populations are geographically distributed, it is an important

<sup>\*</sup> Contribution No. 748 from the National Institute of Genetics, Mishima, Shizuoka-ken 411 Japan. Aided in part by a Grant-in-Aid from the Ministry of Education, Japan.

# TAKEO MARUYAMA

problem to consider the fixation probability in a population with geographical structure. Although they may be usually continuously distributed, the twodimensional stepping stone model should be a good approximation to their structure. In this report I will consider a population consisting of a finite number of partially isolated colonies and obtain an approximation formula for the fixation probability for one locus with two alleles  $A_1$  and  $A_2$  which are additive in fitness.

Moran (1962) gave an alternative method in obtaining the fixation probability U(p) in (1) for a special case of additive gene action. Let  $y^{(t)}$  be the random variable describing the number of  $A_2$  genes at the *t*-th generation in the population. Moran considers the quantity  $E[\exp(zy^{(t)})]$ , where E is the expectation operator and z is a real number. He shows that if z = -2s, then  $E[\exp(-2sy^{(t)})]$  is almost invariant with time, i.e.  $E[\exp(-2sy^{(t)})] \approx E[\exp(-2sy^{(t+1)})] \approx \dots$  Considering this quantity at time zero and at time infinity we have

$$\exp(-2s2Np) = U(p)\exp(-2s2N) + (1 - U(p)),$$

where p and U(p) are the initial frequency and fixation probability of  $A_2$ . Therefore we have

$$U(p) = \frac{1 - \exp\left(-4Nsp\right)}{1 - \exp\left(-4Ns\right)},$$

which is a special case  $(h = \frac{1}{2})$  of the expression for U(p) given in (1).

This can be extended to more general situations, still assuming additive fitnesses  $(h = \frac{1}{2})$ . Suppose that we have a large population of size N and that the population is subdivided into colonies. Let  $N_i$  be the size of colony i,  $Y_i^{(t)}$  be the number of  $A_2$  alleles in colony i at the t-th generation and  $Y^{(t)}$  be the total number of  $A_2$  alleles at the t-th generation, i.e.  $Y^{(t)} = \sum_i Y_i^{(t)}$  and  $N = \sum_i N_i$ . Assume that the samplings of gametes from one generation to the next is done independently in each colony. Then we have,

$$E[\exp(-2sY_1^{(t)})] \times E[\exp(-2sY_2^{(t)})] \times \dots = E[\exp(-2sY^{(t)})].$$
(2)

Now suppose that selection is done independently in each colony. Then

$$E[\exp(-2sY_{i}^{(t)})] \approx E[\exp(-2sY_{i}^{(t+1)})]$$
(3)

for all i, as Moran has shown. Thus

$$\begin{split} E[\exp(-2sY_1^{(t+1)})] \times E[\exp(-2sY_2^{(t+1)})] \times \dots &= E[\exp(-2s(\sum_i Y_i^{(t+1)}))]\\ &\equiv E[\exp(-2sY^{(t+1)})] \approx E[\exp(-2sY^{(t)})] \end{split}$$

follows from (2) and (3). Therefore  $E[\exp(-2sY^{(t)})]$  is invariant over splitting of a population and selection within colonies. The invariance still holds over migration of individuals between colonies since this does not change the total number of  $A_2$ alleles. If each colony can be reached from any other colony by migration in one generation or several generations, either  $A_1$  or  $A_2$  will be eventually lost from the whole population. For such a situation, as above, we have

$$\exp\left(-2sY^{(0)}
ight) pprox U(\overline{p})\exp\left(-2s2N
ight) + (1-U(\overline{p}))$$

in which  $U(\bar{p})$  is the fixation probability of  $A_2$  in the population with the initial frequency,

$$\overline{p} = \frac{1}{N} \sum N_i (Y_i^{(0)}/2N_i) = \frac{1}{N} \sum_i p_i N_i,$$

where  $p_i$  is the initial frequency in colony *i*. Therefore we have

$$U(\overline{p}) = \frac{1 - \exp\left(-4Ns\overline{p}\right)}{1 - \exp\left(-4Ns\right)}.$$
(4)

This is equal to the fixation probability in a panmictic population of size  $N = \sum_{i} N_{i}$ . However it should be noted that if the subdivision of the population prolongs the time of fixation very much formula (4) may not be valid.

In order to check the validity of formula (4), I have performed a number of Monte Carlo simulations by computer. The scheme of the experiment is as follows. A population is divided into colonies of equal size,  $N_i$ . At the beginning of each generation each colony produces infinite number of  $A_1$  and  $A_2$  gametes whose relative frequencies are equal to those of  $A_1$  and  $A_2$  alleles in the colony at the end of the



Fig. 1. (a) Linear stepping stone model, (b) circular stepping stone model and (c) Island model. Open circles indicate colonies and lines indicate migration. In the stepping stone models migration is only between geographically adjacent colonies. In the island model migration occurs between any pair of colonies and the rates are equal for every pair.

No. of of	Colony	Total nopula- N	fioration*	Selection		Ini	tial frequen	cy†	· (	Average initial	Fixation I	probability	No. of simulation
olonies	size	tion size	rate	coefficient	$p_1$	$p_{\mathbf{s}}$	$p_3$	$p_4$	$p_5$	frequency	Formula (4)	í O	experiments
(u)	$(N_i)$	$(N = nN_i)$	(m)	(8)	$p_{6}$	$p_7$	$p_{8}$	$p_{_{9}}$	$p_{10}$	(d)	U(p)	Simulation	performed
						Linear ste	pping stone	) model					
ũ	10	50	0.05	0.05	0.00	00-0	0.10	0.00	0.00	0.02	0.181	0.186	1000
õ	10	50	0.10	0.05	0.00	00-0	0.10	0.00	0.00	0.02	0.181	0.178	1000
10	2.5	25	0.10	0.02	1.00	0.00	0.00	0.00	0-00	0.10	0.209	0.193	963
					00.0	00.0	0.00	0.00	0.00				
10	4	40	0.05	0.01	00-0	00.0	0.00	0.00	0.40	0.04	0.0777	0.0846	910
					0.00	00.0	00-0	0.00	0.00				
10	ũ	50	0.05	0.01	0.00	00.0	0.00	0.00	0.40	0.04	0.0952	0.0889	714
					0.00	00.0	0.00	0.00	0.00				
						Circular ste	spping ston	e model					
5	ŝ	25	0.20	0.10	0.10	0.10	0.10	0.10	0.10	0.10	0.632	0.580	100
2	10	50	0.05	0.10	0.05	0.10	0.05	0.00	0.00	0.04	0.551	0.564	1000
10	ß	50	0.10	0.02	0.10	0.20	0.10	0.30	0.10	. 0.14	0.437	0.474	471
					0.20	0.10	0.20	0.10	00-0				
10	9	50	0.10	0.05	0.10	0-40	0.30	0.20	0.00	0.10	0.632	0.626	561
					0.00	0.00	00.0	0.00	0.00				
10	10	100	0.10	0.10	0.10	00-0	0.00	00.0	0.00	0.01	0.330	0.304	950
					00.0	00.0	0.00	0.00	0.00				
_						Isl	and model						
e	15	45	10.0	0.02	0.05	0.15	0.10	ł	[	0.10	0.311	0.310	510
en	10	30	0.05	0.10	0.05	0.10	0.05		١	0.066	0.550	0.538	2393
ŝ	10	30	0·01	0.10	0.05	0.30	0.10			0.15	0.835	0.814	1020
ŝ	10	30	0.10	0.10	0.05	0.50	0.10		1	0.217	0.926	0.925	1760
en	10	30	0.005	0.10	0.05	0.15	0.10	I	1	0.10	0.699	0.692	1208
en	10	30	0.10	0.10	0.10	0.50	0.10	1	]	0.233	0.939	0.921	882
en	50	50	0.10	0.10	0.01	0-07	0.04		1	0.04	606·0	0.907	224
n	10	30	0.10	0.02	0.20	0.00	0.025	1		0.075	0.835	0.810	241
ŝ	õ	25	0.10	0.10	0.10	0.10	0.00	00.0	00.0	0.04	0.330	0.334	1000
10	ŝ	50	0.05	0.10	0.50	0.00	0.00	00.0	0.00	0.05	0.632	0.607	915
					0.00	0.00	0.00	00.0	00.0				
10	õ	50	0.10	0.05	0.10	0.40	0.30	0.20	0.00	0.10	0.632	0.626	720
					0.00	0.00	0.00	00.0	0.00				
10	10	100	0.10	0.10	0.10	0.00	0.00	00.0	0.00	0.01	0.330	0.301	1000
					0.00	00-0	0.00	00.0	0.00				
* H	or stepp	ing stone m	nodels the	rate betwee	n adjace	nt colonies	is equal to	m/2, and	for the i	sland model	the rate <b>k</b>	oetween an	y pair of
colonie	ss is equ	al to $m/n$ .											
† <i>p</i> :	= Initi	ial frequenc	y of A. g	ene in color	iy i. For	r linear ster	pping stone	model col	ony l is	the one loca	ting at one	end of the	habitat,
colony	2 is the	next colon	y to it and	so on. For c	circular s	tepping stor	ne model co	lony liss	et arbitra.	ry but colon	ies 2, 3,,	, follows to	it in one

Table 1. Comparison of the theoretical value with the value obtained by simulation experiments

https://doi.org/10.1017/S0016672300001543 Published online by Cambridge University Press

224

TAKEO MARUYAMA

previous generation. After production of gametes, migration of gametes takes place at certain rates. After the migration, the gametes mate at random in each colony, and selection occurs separately in each colony. After the selection,  $2N_i$  gametes are chosen for the next generation by binomial sampling in each colony separately. The actual sampling of  $2N_i$  gametes in colony *i* is done as follows: We draw  $2N_i$ pseudo-random numbers uniformly distributed in (0, 1) and compare them with the frequency,  $x_i$ , of  $A_2$  gene after selection in colony *i*. The number of  $A_2$  alleles in colony *i* at the beginning of the next generation is set equal to the number of the pseudo-random numbers drawn which are less than  $x_i$ . This procedure is repeated for each colony for each generation. The population structures used in the simulations are illustrated in Fig. 1. The results of the simulation experiments are presented in Table 1. The numerical results agree well with the theoretical values, and in fact there is no case in which the experimental result deviates significantly from the theoretical value.

I wish to thank Dr Motoo Kimura, who suggested the subject of this paper, Dr Joseph Felsenstein, who corrected the English and offered useful criticisms, Dr William Hill and the referee, who gave many useful suggestions.

#### REFERENCES

- HILL, W. G. & ROBERTSON, A. (1966). The effect of linkage on limits to artificial selection. Genet. Res. 8, 269-294.
- KIMURA, M. (1957). Some problems of stochastic processes in genetics. Ann. Math. Statist. 28, 882-901.
- KIMURA, M. (1962). On the probability of fixation of mutant genes in a population. Genetics, Princeton 47, 713-719.
- KIMURA, M. & OHTA, T. (1969). The average number of generations until fixation of a mutant gene in a finite population. *Genetics, Princeton* 61, 763-771.
- MORAN, P. A. P. (1962). The Statistical Process of Evolutionary Theory. Oxford: Clarendon Press.
- OHTA, T. (1968). Effect of initial linkage disequilibrium and epistasis on fixation probability in small population, with two segregating loci. *Theor. and Appl. Genetics* 38, 243-248.
- ROBERTSON, A. (1960). A theory of limits in artificial selection. Proc. Roy. Soc. Lond. B 153, 234-249.