Selection with Recurrent Backcrossing to Develop Congenic Lines for Quantitative Trait Loci Analysis

William G. Hill

Institute of Cell, Animal and Population Biology, University of Edinburgh, Edinburgh, EH9 3JT, Scotland, United Kingdom Manuscript received July 2, 1997 Accepted for publication November 10, 1997

ABSTRACT

Sewall Wright suggested that genes of large effect on a quantitative trait could be isolated by recurrent backcrossing with selection on the trait. Loci [quantitative trait loci (QTL)] at which the recurrent and nonrecurrent lines have genes of different large effect on the trait would remain segregating, while other loci would become fixed for the gene carried by the recurrent parent. If the recurrent line is inbred and the backcrossing and selection is conducted in a series of replicate lines, in each of which only one backcross parent is selected for each generation, the lines will become congenic to the recurrent parent except for the QTL of large effect and closely linked regions of the genome, and these regions can be identified using a dense set of markers that differ between the parental lines. Such lines would be particularly valuable for subsequent fine-scale mapping and gene cloning; but by chance, even QTL of large effect will be lost from some lines. The probability that QTL of specified effect remain segregating is computed as a function of its effect on the trait, the intensity of selection, and the number of generations of backcrossing. Analytical formulas are given for one or two loci, and simulation is used for more. It is shown that the method could have substantial discriminating ability and thus potential practical value.

 \bf{W} ITH modern molecular methods, it is becoming quent location and cloning; in any case, more informa-
possible to map quantitative trait loci (QTL), tion about biological processes are likely to come from
these pari those regions of the genome that affect traits with poly-
genic expression. The precision with which the QTL used to isolate genes (*i.e.*, QTL) of large effect was genic expression. The precision with which the QTL can be located depends on the populations available, proposed long ago by Wright (1952). He suggested that as well as the size and design of the experiment and the recurrent backcrossing be practiced in which the nonrestatistical methods adopted. To understand the genetic current line is, say, of high performance and the recurcontrol of a trait, the mapping of QTL is only the start; rent line is of low performance, with the parents of the
it is subsequently necessary to identify. if possible. backcross individuals selected each generation for h it is subsequently necessary to identify, if possible, backcross individuals selected each generation for high whether a QTL actually comprises a single genetic locus performance of the trait of interest. Backcrossing leads
and then the actual gene(s) involved. This has not vet to a halving of frequency each generation of genes tha and then the actual gene(s) involved. This has not yet to a halving of frequency each generation of genes that
been accomplished for a continuous trait, although do not affect the trait and are not linked to those that been accomplished for a continuous trait, although Alpert and Tanksley (1996) obtained a clone con-

taining a QTL in tomato. Precise mapping and cloning more likely to be present in the selected individuals, so taining a QTL in tomato. Precise mapping and cloning more likely to be present in the selected individuals, so require well-defined stocks. Multigeneration backcross their expected frequency is >0.5 and the backcross line
lines, more specifically congenic lines, for which all the should eventually remain segregating only for genes lines, more specifically congenic lines, for which all the should eventually remain segregating only for genes of genome except the region of interest comes from an large effect. In simple terms, a gene would need to genome except the region of interest comes from an large effect. In simple terms, a gene would need to inbred
inbred line, are likely to be of particular value for QTL confer a twofold higher fitness to survive indefinitel inbred line, are likely to be of particular value for QTL identification (Démant and Hart 1986; Tanksley and a large backcross population. In practice, lines are finite
Nel son 1996). Sets of congenic lines can be used to in size, so even genes with very large effect may be lost, Nelson 1996). Sets of congenic lines can be used to in size, so even genes with very large effect may be lost,
obtain narrow intervals for a QTL, providing its effect albeit slowly. While it may be feasible to maintain one obtain narrow intervals for a QTL, providing its effect albeit slowly. While it may be feasible to maintain one
is sufficiently large that genotypes can be assigned accu-
large backcross line with several parents each gene

and large effects, in practice the former cannot be between-family environmental covariances, important manned with sufficient precision to be useful for subsection in species such as mice, increase the errors in selection mapped with sufficient precision to be useful for subse-

is sufficiently large that genotypes can be assigned accu-
rately (Darvasi 1997). tion, this provides only one replicate and requires that
While it is desirable to isolate OTL with both small selection be practiced between While it is desirable to isolate QTL with both small selection be practiced between and within families, so
nd large effects, in practice the former cannot be setween-family environmental covariances, important

The recurrent backcrossing enables all but very closely linked markers and QTL to recombine, thereby facilitat-*Corresponding author:* William G. Hill, Institute of Cell, Animal and Population Biology, University of Edinburgh, West Mains Road, Edin-
Population Biology, University of Edinburgh, West Mains Road, Edin-
burgh, EH9 3JT, The method is likely to be of most use in species such

as Drosophila,mice, and Arabidopsis, which have ashort ANALYSIS generation interval and for which inbred lines are avail-
able. It has been proposed by Snel l(1958) as a means
of identifying histocompatibility genes, and it has been
used by Beebe *et al.* (1997) to identify loci associ with resistance to *Leishmania major* in mice. The principle is equipment (lines) are maintained independently. In each genera-
ples and methods, particularly for detection of loci asso-
ciated with a disease with all-or-n ciated with a disease with all-or-none expression, have for the quantitative trait, and the highest scoring individ-
been investigated by N. J. Schork, A. M. Beebe, B.
Thiel, P. St. Jean, and R. L. Coffman, (unpublished l data), in which the scheme generally involves taking sublines from individuals who show resistance so that a sublines from individuals is built up. The method pedigree of resistant individuals is built up. The method is t *al.* 1996), in which regions of chromosomes in related QTL are expressed in units of this within-family (mainly individuals with extreme phenotypes for a quantitative environmental) standard deviation.
 Extreme phenotyp trait carrying putative QTL are identified by a genome- **Single locus:** This simple example serves as a referoped (Thomas *et al.* 1994; N. J. Schork, A. M. Beebe, from the nonrecurrent and *A'* from the recurrent par-B. Thiel, P. St. Jean, and R. L. Coffman, unpublished ent confers an increase in the heterozygote of *a* SD on data). The use of backcrossing with selection to identify the trait, and that it is unlinked to any other QTL a data). The use of backcrossing with selection to identify the trait, and that it is unlinked to any other QTL affect-
QTL by their linkage to markers has similarities to the that ing the trait. It is necessary to compute t QTL by their linkage to markers has similarities to the ing the trait. It is necessary to compute the probability selection scheme practiced by G. Bulfield from an $P(n,a)$ that the offspring of generation $t + 1$ selected (Keightley and Bulfield 1993; Keightley *et al.* 1996; be readily computed using binomial probabilities for Ollivier *et al.* 1997), but differs in that the backcross the number *k* of heterozygous offspring among the *n*

ent parts of the genome, is to maintain a series of sepa-
 $\begin{array}{rcl} & -k \text{ homozygotes} & \text{have} & \text{performance} & \text{less than } x, \text{ the} \\ \text{rate single-family lines during the backcrossing, with} & \text{probabilities for each individual being } \Phi(x) & \text{and } \Phi(x + x) & \text{and} & \text{if } x \neq 0. \end{array}$ each family maintained by only one selected parent each *a*), respectively, where $\phi(x)$ and $\Phi(x)$ denote the density detected by undertaking a genome-wide scan of molecu-
the standardized normal distribution. Then, using the lar markers only after several generations of backcross-
method of Hill (1969), the probability an *AA*^{*'*} heterozying and only on the one selected individual of each gote is selected is as follows: line, and by identifying regions that have remained seg-
regating in many of the families. Subsequently, these $P(n,a) = \sum\limits_{i=1}^n \frac{n!}{k(n-k)! z^n}$ regions that remain segregating can be investigated Figure in the continuous continued $\int_{-\infty}^{\infty} [\Phi(x)]^{k-1} [\Phi(x+a)]^{n-k} \phi(x) dx$, more finely by further developing lines by continued backcrossing, but now maintaining segregating the which reduces to marker or flanking markers that are identified as close to QTL in the initial screen and by progeny testing

crossing with selection to develop such independent the individual is an *AA*^{\prime} heterozygote and, if it is *AA*^{\prime}, congenic lines are examined, for example, in terms of a probability of $[\Phi(x)/2 + \Phi(x + a)/2]^{n-1}$ that all other the probability that QTL remain segregating as a functionally members have a lower phenotypic value. For $a =$ tion of the size of its effect on the trait, the number of generations of backcrossing, and its linkage to other $P(n,a) = 1/2$, as expected for a neutral gene, since the QTL. Ways to analyze and interpret the data are con- highest scoring individual is equally likely to be *AA*9 or *A*^{\prime}*A*^{\prime}; and for $a \rightarrow \infty$, the integral reduces to $(2^{n} - 1)$

ence for others. It is assumed that a QTL with allele A $P(n, a)$ that the offspring of generation $t + 1$ selected inbred cross in which changes in marker frequency are from a heterozygous backcross parent of generation *t* monitored in replicate lines to infer QTL position is itself heterozygous for the locus. This probability can is itself heterozygous for the locus. This probability can Ollivier *et al.* 1997), but differs in that the backcross the number *^k* of heterozygous offspring among the *ⁿ* selected lines are congenics and immediately useful for recorded and order statistics for the probability that the
precision mapping and gene cloning. highest scoring offspring is heterozygous. For example, recision mapping and gene cloning. has the particu-highest scoring offspring is heterozygous. For example,
A formal backcrossing scheme, which has the particu-higher of the *k* heterozygotes has phenotypic value *x* for if one of the *k* heterozygotes has phenotypic value *x* for lar benefit that it leads to the production of several the trait with probability φ(*x*)*dx* and is the highest in independent lines that are congenic for small but differ-
ent parts of the genome, is to maintain a series of sepa-
 $-k$ homozygotes have performance less than *x*, the probabilities for each individual being $\Phi(x)$ and $\Phi(x +$ generation. The presence of QTL of large effect is then and cumulative distribution functions, respectively, of

$$
P(n,a) = \sum_{k=1}^{n} \frac{n!}{k!(n-k)!2^n} k
$$

$$
\int_{-\infty}^{\infty} [\Phi(x)]^{k-1} [\Phi(x+a)]^{n-k} \phi(x) dx
$$

$$
P(n,a) = (n/2^n) \Big|_{-\infty}^{\infty} \left[\Phi(x) + \Phi(x+a) \right]^{n-1} \phi(x) dx \quad (1)
$$

within families to identify the marker-associated effect. In the simplified Equation 1, for each of the *n* individu-
In this paper, the properties of the method of back-
als in the family, there is a probability of one-ha als in the family, there is a probability of one-half that family members have a lower phenotypic value. For $a =$ 0, the integral in Equation 1 reduces to $2^{n-1}/n$ and

Probability *P***(***n,a***) that a heterozygote with a QTL of effect** *a* **SD units is selected from the offspring of a backcross mating, with selection of the best one from** *n*

a	2 m.	3	4	6	8	12	20
$\mathbf{0}$	$0.5\,$	0.5	0.5	0.5	0.5	$0.5\,$	0.5
0.125	0.5176	0.5264	0.5321	0.5395	0.5444	0.5508	0.5581
0.25	0.5351	0.5526	0.5640	0.5786	0.5882	0.6007	0.6150
0.5	0.5691	0.6036	0.6257	0.6538	0.6718	0.6948	0.7203
	0.6301	0.6952	0.7352	0.7831	0.8115	0.8446	0.8769
1.5	0.6778	0.7667	0.8186	0.8751	0.9045	0.9340	0.9574
$\mathbf{2}$	0.7107	0.8160	0.8743	0.9311	0.9560	0.9763	0.9882
$\rightarrow \infty$	0.75	0.875	0.9375	0.9844	0.9961	0.9998	1.0000

n and $P(n,a) = 1 - (1/2)^n$, which is the probability selection and probabilities of retention will be lower that at least one of the offspring is a heterozygote and than those shown in Table 1, where the effect of the available to be selected. Also, the probability that a ho- gene is expressed in terms of the within-family environmozygote *A'A'* is selected is given by $P(n - a) = 1$ mental SD. This problem is visited again later, but first, $P(n,a)$. Equation 1 can readily be evaluated using let us assume for simplicity that the (unit) within-family Simpson's rule numerically. Results are given in Table 1, variance remains constant. The probability $P(n,a)$, that and these and later results obtained using order statistics the QTL remains segregating for *t* generations in a line

These values can be approximated for small values intensity each generation is therefore of *a*, by $P(n,a)_t = [P(n,a)]^t$

$$
P(n,a) \sim 0.5 + i a/4, \qquad (2)
$$

where *i* is the standardized selection intensity for the generations, Equation 3 has to be replaced by the prod-
normal distribution with finite numbers recorded. For your of the appropriate values or, equivalently, the h normal distribution with finite numbers recorded. For uct of the appropriate values or, equivalently, the har-
 $n = 2, 3, 4, 6, 8, 12,$ and 20, $i = 0.56, 0.85, 1.03, 1.27,$ monic mean of $P(n,a)$ used. Unless *n*, varies gre $n = 2, 3, 4, 6, 8, 12,$ and 20, $i = 0.56, 0.85, 1.03, 1.27,$ monic mean of $P(n_b a)$ used. Unless n_t varies greatly, 1.42, 1.63, and 1.87, respectively (Falconer and simply using an approximate mean of *n* in Equation 3 1.42, 1.63, and 1.87, respectively (Falconer and simply using an approximate mean of *ⁿ* in Equation 3 Mackay 1996). Comparing these values with those in suffices. For example, if n_i takes values of 2, 3, 4, 5, and Table 1, it is seen that the approximation is adequate 6 in successive generations and $a = 1$, the probabil Table 1, it is seen that the approximation is adequate $\begin{array}{r} 6 \text{ in successive generations and } a = 1, \text{ the probability} \\ \text{for } a \leq 0.5. \end{array}$

of backcrossing, the variance is likely to be inflated by 0.21 .
segregation at other loci in a way that the accuracy of S_0

ual of *n* is selected each generation: $P(n,a)$ blotted against *t* for $a = 0, 0.5, 1, 1.5,$ and 2, and $n = 4$ and 12.

were checked by Monte Carlo simulation. maintained with one parent and the same selection

$$
P(n,a)_t = [P(n,a)]^t.
$$
 (3)

P(*n,a*) α , $f: a \leq 0.5$.
Repeated backcrossing: In the first few generations inserting $n = 4$ in each generation in Equation 3 gives inserting $n = 4$ in each generation in Equation 3 gives

> Some examples using Equation 3 are given in Figure 1. The main point is that the differences between the probability of continued segregation of a QTL of large effect and a QTL of small effect becomes wider as more generations of backcrossing are undertaken and more intense selection is practiced. Of course, if backcrosssing is continued too long, even those of very large effect are lost. In principle, there is some intermediate optimum time for discriminating among QTL of specified effects, if such can be defined.

Since a number of independent replicate lines can be kept, it is useful to reconsider these results in terms of the distribution of the number of lines in which a QTL of specified effect would be segregating. If *M* lines are maintained, then the expected number in which there is segregation at generation *t* is $MP(n, a)$. The actual number segregating, *m*, has a binomial distribu-Figure 1.—Probability that a QTL of effect *a* remains segre-
gating for *t* generations of backcrossing when the best individ-
ual of *n* is selected each generation: $P(n|a)$ plotted against *t* Hence, we assume that *m* parameter *MP(n,a)_t*. Some examples are given in Table

1344 W. G. Hill

TABLE 2

\boldsymbol{M} n, t			10 4, 4			20 4, 4			10 12, 8	
a	\boldsymbol{m}	\geq 1	\geq 2	≥ 4	\geq 1	\geq 2	≥ 4	\geq 1	\geq 2	≥ 4
$\bf{0}$		0.465	0.130	0.004	0.713	0.355	0.038	0.038	0.001	0.000
0.125		0.558	0.197	0.010	0.799	0.476	0.079	0.081	0.003	0.000
0.25		0.636	0.269	0.020	0.868	0.600	0.147	0.156	0.013	0.000
0.5		0.784	0.453	0.070	0.953	0.810	0.368	0.419	0.104	0.002
1		0.946	0.789	0.335	0.997	0.980	0.834	0.925	0.730	0.262
1.5		0.989	0.938	0.656	1.000	0.999	0.978	0.997	0.979	0.829
$\mathbf{2}$		0.997	0.980	0.834	1.000	1.000	0.997	1.000	0.998	0.964
$\longrightarrow \infty$		1.000	0.996	0.949	1.000	1.000	1.000	1.000	0.999	0.989

Probability distribution of the number *m* **of a total of** *M* **lines in which a QTL of effect** *a* **SD units remains segregating for** *t* **generations with selection of the best one from** *n* **each generation**

2, for experiments in which 10 or 20 lines are main- and 0.292, respectively. It seems that the quantitative tained. For example, if 10 lines are maintained with differences are rather small, and that the simple calculaselection of one from $n = 4$ for $t = 4$ generations, a tions are adequate unless the segregation variance, V_{A} , QTL with effect of 0.25 SD has a probability of $<2\%$ of is much larger than *V_E* (*i.e.*, heritability in the F₂ considremaining segregating in four or more lines, whereas a erably in excess of one-half) and if, because of the selec-QTL with effect of 1.5 SD or more, has $a < 1\%$ chance tion, it declines much more slowly than one-half per of being lost from all 10 lines and a 66% chance of generation, *i.e.*, there are other QTL of large effect or remaining segregating in four or more lines. linked in coupling phase.

segregation at other loci than that being analyzed, there only on keeping QTL of large effect segregating, but will be additional variation within families, particularly also on losing those of small or negative effect that may
in early generations. With additive genes and genetic be maintained by linkage to a QTL of large effect. variation V_A caused by background genetic variation in us consider a model where there are two additive (*i.e.*, the F_2 , and assuming for simplicity that the background nonepistatic) QTL. A_1 and A_2 , on the same variation is caused by very many unlinked loci, each of some, with effects a_1 and a_2 within family standard devia-
very small effect, there will be $V_A/2$ in the first backcross tions, respectively. The recombinatio and $V_A/2$ ^t in the the backcross. There will also be variance $a^2V_E/4$ caused by the QTL under consideration in the parent is a double heterozygote, A_1A_2/A_1 first backcross, which with additive gene action implies four possible offspring genotypes selected in the next $a^2V_E/2$ in the F₂, where V_E is the within-family environmental variance. Consider a simple case, where $V_A = V_E$ and $a = 1$, so the total genetic variance in the F_2 would be $3V_{\rm E}/2$, and the within-family environmental plus background genetic variance in the backcross would background genetic variance in the backcross would
be $[1 + (1/2)^t]V_E$. Hence, the effect of the QTL in the probability that the double beterozygote is selected be $[1 + (1/2)^r]v_E$. Hence, the effect of the Q1L in
environmental SD units would be 0.816, 0.894, 0.942,...
in backcross generations $t = 1, 2, 3,...$ For example, $P(4,$
0.816) = 0.698, $P(4, 0.894) = 0.714$, and $P(4, 0.942) =$ 0.724, whereas $P(4,1) = 0.735$. Hence, the probability that the QTL remains segregating to generations 1, 2, 3, and 4 is 0.697, 0.498, 0.361, and 0.263, respectively, Similar equations apply for sampling the other genowhereas the equivalent values assuming that $P(4,1)$ is types, the term in $(1 - r)$ before the integral being

Correction for background genetic variation: With **Two loci:** The usefulness of the method depends not be maintained by linkage to a QTL of large effect. Let nonepistatic) QTL, A_1 and A_2 , on the same chromotions, respectively. The recombination fraction is *r* between the *loci*. In any generation where the backcross $_1'A_2'$, there are *generation: the double heterozygote with both* A_1 *and* T_1A_2' with probability $P^{12}(n,a_1,a_2)$, $\frac{1}{2}/A_1'A_2'$ with probability $P^{12'}(n,a_1,a_2)$, or only A_2 , or both lost.

$$
P^{12}(n,a_1,a_2) = [n(1 - r)/2^n] \int_{-\infty}^{\infty} [(1 - r) \Phi(x + a_1 + a_2) + r \Phi(x + a_1) + (1 - r) \Phi(x)]^{n-1} \phi(x) dx.
$$
\n(4)

appropriate each generation are 0.735, 0.541, 0.397, replaced by *r* for recombinant types. If only one QTL

Probabilities of selection of each alternative genotype for a two-locus model with additive effects *a***¹** between alleles A_1 and A_1' at locus 1 and a_2 between A_2 and A_2' at locus 2, and recombination **fraction** *r* **between the loci—selection of the best one from** *n*

\boldsymbol{n}			4		12			
\boldsymbol{r}	A_1A_2	A_1A_2'	$A_1'A_2$	$A_1'A_2'$	A_1A_2	A_1A_2'	$A_1'A_2$	$A_1'A_2'$
				a ₁ : 0.5	a_2 : 0.5			
0.5	0.380	0.242	0.242	0.136	0.468	0.222	0.222	0.089
0.2	0.596	0.095	0.095	0.214	0.704	0.083	0.083	0.131
0.1	0.666	0.047	0.047	0.240	0.776	0.040	0.040	0.144
0.05	0.701	0.023	0.023	0.252	0.811	0.020	0.020	0.150
$\bf{0}$	0.735	0.000	0.000	0.265	0.845	0.000	0.000	0.155
				$a_1: 0.75$	a_2 : 0.25			
0.5	0.377	0.305	0.183	0.135	0.456	0.319	0.139	0.086
0.2	0.594	0.120	0.072	0.214	0.697	0.122	0.052	0.129
0.1	0.665	0.060	0.036	0.239	0.772	0.060	0.026	0.143
0.05	0.700	0.030	0.018	0.252	0.808	0.030	0.013	0.149
$\bf{0}$	0.735	0.000	0.000	0.265	0.845	0.000	0.000	0.155
				$a_1: 1.0$	a_2 : 0.0			
0.5	0.368	0.368	0.132	0.132	0.422	0.422	0.078	0.078
0.2	0.588	0.147	0.053	0.212	0.676	0.169	0.031	0.124
0.1	0.662	0.074	0.026	0.238	0.760	0.084	0.016	0.140
0.05	0.698	0.037	0.013	0.252	0.802	0.042	0.008	0.148
$\bf{0}$	0.735	0.000	0.000	0.265	0.845	0.000	0.000	0.155
				a_1 : 1.5	a_2 : -0.5			
0.5	0.336	0.476	0.064	0.124	0.317	0.611	0.017	0.054
0.2	0.567	0.201	0.026	0.206	0.602	0.282	0.009	0.108
0.1	0.650	0.102	0.013	0.235	0.717	0.148	0.005	0.130
0.05	0.692	0.051	0.007	0.250	0.779	0.076	0.002	0.142
$\bf{0}$	0.735	0.000	0.000	0.265	0.845	0.000	0.000	0.155

havior in that line is described as would be for single 0.120 , and 0.072, respectively, in Table 3.

and $a_2 = 0$ can be obtained from Table 1 by noting that ample, consider the case where the double heterozygote different outcomes, but as linkage becomes tight, the

values of ia_1 and ia_2 are not too large, for example: additive case.

$$
P^{12}(n,a_1,a_2) \sim (1-r)[1 + i(a_1 + a_2)/2]/2,
$$

\n
$$
P^{12'}(n,a_1,a_2) \sim r[1 + i(a_1 - a_2)/2]/2.
$$
 (5)

and similarly for $P^{1'2}(n,a_1,a_2)$. For example, with $r=0.2,$ struct the 3×3 transition matrix **B**, for which the rows these approximations give values of $P^{12}(4, 0.75, 0.25)$ and columns identify the following states: (1) A_1 and $(4, 0.75, 0.25) = 0.126$, and $P^{1/2}(4, 0.75,$

remains segregating, in subsequent generations its be- 0.25 = 0.074, compared with the exact values of 0.594,

loci (1). The examples in Table 3 are for nonepistatic loci, Examples are given in Table 3 of the probabilities for *i.e.*, with additive effects in heterozygotes over loci. Equaa series of examples in which the sum of the effects of tion 4 changes in a straightforward way if this is not the two loci are the same $(a_1 + a_2 = 1)$, but their relative the case, and probabilities that one or both of the loci sizes differ ($a_1 = 0.5$, 0.75 and 1.5). Results for $a_1 = 1$ continue to segregate change correspondingly. For ex- $P^{12}(n,1,0) = (1 - r)P(n,1)$, where $P(n,1)$ is given by is 1 SD superior to each single heterozygote and the Equation 1. If linkage is loose, it is seen that the extreme double homozygote. For complete linkage $(r = 0)$, recases of equal effects $(a_1 = a_2)$ and $a_2 < 0$ give quite sults are therefore the same as in each example in Table 3, whereas for $r = 0.2$, $P^{12} = 0.6376$, $P^{12'} = P^{1'2} = 0.0604$, survival probability of the double heterozygote depends and $P^{1'2'} = 0.2416$, and for unlinked loci ($r = 0.5$), little on the relative size of effects of the two loci. $P^{12} = 0.4502$, and $P^{12'} = P^{1'2} = P^{1'2'} = 0.1832$, *i.e.*, single These probabilities can be approximated, providing heterozygotes are less likely to be selected than in the

 $p_1(n, a_1, a_2) \sim (1 - r)[1 + i(a_1 + a_2)/2]/2,$ To consider the passage over several generations of each of the genotypic classes, it is necessary to include *p*₁, *a*₁, *a*₂) $\sim r[1 + i(a_1 - a_2)/2]/2,$ (5) the probabilities of th the probabilities of the single locus segregants. We con- A_2 , (2) A_1 but not A_2 , and (3) A_2 but not A_1 ; the elements

1346 W. G. Hill

TABLE 4

Probabilities of segregation after *t* **generations of alternative genotypes for a two-locus model with** additive effects a_1 between alleles A_1 and A_1' at locus 1 and a_2 between A_2 and A_2' at locus 2, with **recombination fraction** *r* **between the loci—selection of the best one from** *n* **each generation**

\boldsymbol{n}		4			$\overline{4}$	12			
t	$\boldsymbol{4}$				8	8			
\boldsymbol{r}	A_1A_2	$A_1'A_2$	A_1A_2'	A_1A_2	$A_1'A_2$	A_1A_2'	A_1A_2	$A_1'A_2$	A_1A_2'
				$a_1: 0.5$	a_2 : 0.5				
0.2	0.126	0.087	0.087	0.016	0.024	0.024	0.060	0.054	0.054
0.05	0.241	0.027	0.027	0.058	0.011	0.011	0.186	0.023	0.023
				$a_1: 0.75$	a_2 : 0.25				
0.2	0.125	0.126	0.056	0.016	0.043	0.013	0.055	0.117	0.021
0.05	0.240	0.040	0.018	0.058	0.018	0.006	0.182	0.047	0.010
				$a_1: 1$	$a_2: 0$				
0.2	0.120	0.172	0.034	0.014	0.071	0.006	0.043	0.215	0.007
0.05	0.238	0.054	0.012	0.057	0.029	0.003	0.172	0.087	0.004
				$a_1: 1.5$	a_2 : -0.5				
0.2	0.104	0.276	0.011	0.011	0.152	0.001	0.017	0.048	0.001
0.05	0.223	0.089	0.004	0.053	0.061	0.001	0.136	0.217	0.001

bi,*^j* specify the transition probability from state *i* at gener- and are simply a special case of the two-locus analysis ation *t* to state *j* at generation $t + 1$. (Alternatively, a given above. Let us assume that A_1 is the QTL and A_2 4×4 matrix can be used, with the fourth row and is the marker, *i.e.*, $a_1 =$ and $a_2 = 0$, with the recombinacolumn denoting the case where neither A_1 nor A_2 are interest to fraction between the loci equal to *r*. Then the elesegregating; because this is an absorbing state, the com- ments of **B** are given by p **11** p **(***n***)**, p *p***₁** p **(***n***),** p **(***n***),** p **(***n***),** p **^{***b***}),** p **(***n***),** p **^{***h***}),** p **_{***h***}^{** $n), p **_{***h***}^{** $n), p **_{***h***}^{** $n), p **_{***h***}^{** $n), p **_{**}}}}}$$$$ Hence, using the single locus formulas from the preceding section,

$$
\mathbf{B} = \begin{pmatrix} P^{12}(n, a_1, a_2) & P^{12'}(n, a_1, a_2) & P^{12}(n, a_1, a_2) \\ 0 & P(n, a_1) & 0 \\ 0 & 0 & P(n, a_2) \end{pmatrix} .
$$
 (6)

Assuming the population starts in the state where both the QTL is A_1 and A_2 are segregating, from Equation 6, it can be shown that at generation *t*, the probability it remains segregating without the QTL

$$
P^{12}(n, a_1, a_2)_t = b_{11}^t, \tag{7a}
$$

$$
P^1(n, a_1, a_2)_t = b_{12}(b_{11}^t - b_{22}^t) / (b_{11} - b_{22}), \text{ and } (7b)
$$

$$
P^{2}(n, a_{1}, a_{2})_{t} = b_{13}(b_{11}^{t} - b_{33}^{t})/(b_{11}^{t} - b_{33}^{t}). \qquad (7c)
$$

For the example given in Table 3, results for segration probabilities for four and eight generations are given in probability the marker is retained. Because the probabil-Table 4. Although the probability that both loci remain ities that QTL are retained for many generations are segregating is not greatly affected by the relative magni-
segregating is not greatly affected by the relative ma segregating is not greatly affected by the relative magni-
tude of the gene effects (and no probabilities of reten-
2 SD or so (Figure 1), it is clear that only very tightly tion are high in this example because the total effect is linked markers are likely to be of value in QTL detec-
only $a_1 + a_2 = 1$ and $n = 4$), the QTL of smaller or tion. An illustration is given in Table 4 ($a_1 = 1$, a negative effect has a low probability of remaining segre- 0). Hence, the marker analysis after backcrossing needs gating alone for many generations, so the method does to be done with very closely spaced markers in a genomehave some discriminating power. The scane wide scan.

$$
b_{11} = (1 - r)P(n,a), b_{12} = rP(n,a), b_{13} = r[1 - P(n,a)],
$$

$$
b_{22} = P(n,a), b_{33} = \frac{1}{2}
$$

where $P(n,a)$ is given by Equation 1. An example for a marker locus is given as part of Table 3 $(a_1 = 1, a_2 = 0)$. The probability, from Equations 7a and 7c, respectively, that the marker remains segregating in coupling with

$$
P^{12}(n,a,0)_t = [(1 - r)P(n,a)]^t,
$$

$$
f_{22}^{l'}/(b_{11}-b_{22}), \text{ and } (7b) \qquad P^{l'2}(n,a,0)_l = [r(1-P(n,a)]\{\langle \frac{l}{2}\rangle^l - [(1-r)P(n,a)]\}^l / (b_{11}-b_{33}).
$$

\n
$$
f_{33}^{l'}/(b_{11}-b_{33}). \qquad (7c) \qquad f_{22}^{l'} = [(1-r)P(n,a)],
$$

and their sum, $P^{12}(n,a,0)_t + P^{12}(n,a,0)_b$ is the overall 2 SD or so (Figure 1), it is clear that only very tightly tion. An illustration is given in Table 4 ($a_1 = 1$, $a_2 =$

Marker segregation: The previous analyses have been If there are two QTL, the fate of alleles at a marker restricted to the fate of the QTL, but their segregation locus, say A_3 , depends on whether it is between or outhas to be detected by means of molecular markers. The side this pair. If A_3 is outside the interval A_1 – A_2 , then its calculations for individual markers are straightforward probability of segregation is given by expanding the

Probabilities of segregation of multiple QTL and markers, computed using Monte Carlo simulation with 500 replicates*

L		50			100			200			400	
\boldsymbol{a}	0.1	0.2	0.4	0.1	0.2	0.4	0.1	0.2	0.4	0.1	0.2	0.4
Position												
0. 20 end markers	0.18	0.32	0.46	0.11	0.20	0.26	0.09	0.10	0.15	0.07	0.08	0.09
1, 19 end QTL	0.20	0.34	0.50	0.12	0.23	0.32	0.11	0.14	0.18	0.08	0.11	0.15
2. 18 markers	0.21	0.36	0.54	0.13	0.25	0.32	0.11	0.14	0.22	0.08	0.09	0.14
3 , 17 mid QTL	0.21	0.42	0.62	0.13	0.30	0.43	0.12	0.18	0.30	0.08	0.12	0.16
$4 16$ mid markers	0.21	0.42	0.62	0.13	0.30	0.41	0.12	0.18	0.28	0.08	0.11	0.18

 $*$ SE (probability estimate) $<$ 2%, dependent on actual probability and map position.

A chromosome of map length *L*cM comprises 21 equally spaced loci, numbers *0* and *20* being at the ends. There are QTL of effect *a* in coupling at positions *1*,*3*,..., *19*, and markers with no effect at positions *0*, *2*, ..., *20*. Results given are averages over the loci indicated. $n = 4$, $t = 4$.

formulas given in Equation 3. If *A*³ lies outside the inter- chromosomes is 4 SD. In general, there will be greater val, but nearer to A_2 , for example, the probability that discrimination if selection is more intense and the numall three loci remain segregating is given by $(1 - \mathbf{b})$ bers of generations are longer than the examples in r_{23}) $P^{12}(n,a_1,a_2)$. If A_3 lies between A_1 and A_2 , then, for Table 5 ($n = 4$, $t = 4$). A model with very many QTL example, the probability that all three loci remain segre- of very small effect in coupling would give similar results gating is $[(1 - r_{13})(1 - r_{23})/(1 - r_{12})]P^{12}(n, a_1, a_2)$. The to those in Table 5, as seen by the similar segregation matrix has to be formally extended to consider seven probabilities for QTL and markers. possible classes (all three loci, three pairs, and three Unless the chromosome is very long (*L* > 200) and singles), but the calculations are straightforward. \blacksquare individual QTL are all of large effect (say $a > 1$), an

cerned with the outcome of backcrossing when there repulsion of QTL, *i.e.*, alternating positive and negative are only one or two QTL on the chromosome affecting effects on the trait along the chromosome with no net the trait under selection. An alternative model is that effect of the QTL together on the chromosome, would the difference in performance between the recurrent behave in a very similar way to the case in which all loci and nonrecurrent parent lines are caused by many QTL are neutral. In general, there will be greater discriminaof (mainly) small effect on each chromosome. Some tion if selection is more intense and the numbers of examples have been considered using the Monte Carlo generations are longer than the examples in Table 5 simulation, with a model of a chromosome of map $(n = 4, t = 4)$. length *L*cM and typically 21 loci simulated at equal **Interspersed** *inter se* **matings:** QTL of small effect, spacing, with the most distant at the ends of the chromo- particularly if they are partially recessive to that in the some. Ten of these loci, numbers *1* (*i.e.*, at position recurrent parent, have a low probability of retention. It 0.05*L*), *3*,..., *19*, were assumed to be QTL of equal effect, is possible to increase the probability of QTL segregaand the remaining 11 loci, numbers θ , θ ,..., θ , were tion by increasing the strength of the selection in inassumed to be markers with no effect on the trait. The creasing frequency relative to that of backcrossing in middle or the end of the chromosome, unless the chro- here, is to intersperse a generation of *inter se* mating mosome is of length 200 cM or more. Similarly, the between each generation of backcrossing, *i.e.*, to allow probability that individual markers remain segregating two generations of selection per generation of backis little different from that of the QTL between which crossing. For simplicity, it is assumed that the same famthey lie. Hence, only summary figures are given for the ily size is used in each case: in the backcrossing generaexamples in Table 5. If the chromosome is short $(L <$ tions, the best male (or female) from *n* of that sex is fects of 0.4 SD or less. If it is long $(L > 200)$, the recorded are selected and mated. The important differthan for neutral genes (6% in the example of $t = 4$ be made between two heterozygotes so that homozyas 0.4 SD and the total difference between the ancestral the next backcross generation.

Multiple linked QTL: The preceding analysis is con-
alternative extreme model in which there is complete

probabilities that individual QTL remain segregating reducing frequency. One possible method, which fits do not differ greatly whether or not they are near the within the independent family (line) structure discussed 100), the probability that loci on it remain segregating selected; in the *inter se* generation, the best male from is quite substantial, even if the individual loci have ef- *n* males recorded and the best female from *n* females probability of continued segregation is a little higher ence from the previous analysis is that now matings can generations), even if the individual effects are as large gotes for the QTL of interest may then be selected for extending the formula, as exemplified by Equation 4. multiple matings. Let these probabilities be, for example, $P^{AA}(n, a^*, d^*)$. The full two-generation process can be described by a DISCUSSION transition matrix C, in which the rows and columns denote the genotype of the backcross parent, *AA* for To convey some "feel" for the results, examples of the first and AA['] for the second (a third row and column simulated data sets are given in Table 7, in each case for could be added for the absorbing state when the back- a single chromosome of length 1 Morgan and following

$$
C = {P^{AA}(n,a^*,d^*) \n \sum_{\{P(n,a^* + d^*)\}^2 P^{AA}(n,a^*,d^*) \n \sum_{P^{AA'}(n,a^*,d^*)} P^{AA'}(n,a^*,d^*) \n \sum_{\{P(n,a^* + d^*)\}^2 \sum_{P^{AA'}(n,a^*,d^*)} P^{AA'}(n,a^*,d^*)}
$$

In the first row of **C**, because the backcross parent is would differ among the models (unless there was no
 AA, the mating for the *inter se* generation is always *AA'* recombination), being largest with only one QTL d × AA', so the probabilities c_{11} and c_{12} reter to the selection of AA and AA', respectively, from among their off-
spring. In the second row, where the backcross parent in the majority of the replicate backcross li *d**)]² that both the selected male and female for the *inter* number of QTL accounting for the line difference on *se* mating are heterozygote, which leads immediately to this chromosome, but that many marker configurat *se* mating are heterozygote, which leads immediately to this chromosome, but that many marker configurations c_{21} and the first term in c_{22} . The second term in c_{22} is can appear for two or more quite different the product of the probabilities, $2P(n,a^*$ + of QTL effects, and that identifying whether one or d^*)[1 – $P(n,a^* + d^*)$], that the *inter se* mating is between more QTL are responsible for the marker effects seen a homozygote and heterozygote, and $P(n, a^* + d^*)$, that is unlikely to be feasible from the marker distribution

In Table 6, examples are given assuming that $n = 4$ cult to distinguish between one QTL and a pair of closely individuals are recorded per family in both the back-
inked QTL (Haley and Knott 1992: Jansen 1993: cross and *inter se* mating generations, for different de-
grees of dominance. The value of *t* refers to the number Putative exgrees of dominance. The value of *t* refers to the number Putative evidence for a QTL in the region of a marker of backcross generations completed, and the probabili-
ties given are that the QTL is still segregating, *i.e.*, the replicate lines than expected by chance. If there is no ties given are that the QTL is still segregating, *i.e.*, the replicate lines than expected by chance. If there is no
individual selected from the *inter se* generation is either QTL in the region, the probability that the individual selected from the *inter se* generation is either QTL in the region, the probability that the marker re-*AA* or *AA'*. For reference, to define the rate of loss after mains segregating is $1/2_b$ and if *M* lines are maintained, a few generations, values of $1 - \lambda$, where λ is the larger the probability that it is fou eigenvalue of **C**, are also given and can be compared directly with the probabilities $1 - P(n,a)$, which equal example, with four generations of backcrossing, the 1 – eigenvalue for a 1×1 matrix), from Table 1 when probability that it is found in three or more lines is only backcrossing with selection is practiced. $\leq 5\%$ (0.026, extending results of Table 2). Hence, in

crossed individuals. In the additive case, the inter- ment run for eight generations with 10 lines, any region

In the previous analysis of backcrosses alone, the spersed generation does not half the rate of loss (*i.e.*, quantity *a* was used for simplicity to define the homozy- $1 - \lambda$) unless the effect of the QTL is quite large. gote–heterozygote difference; a fuller definition is now Because the time (*i.e.*, total number of generations) required, and the notation of Falconer and Mackay required to reduce the probability of segregation of (1996) is adopted, adding an asterisk to distinguish val- neutral background genes is doubled, it is moot whether ues from those above: the genotypic values (in within there is benefit in inserting the *inter se* generation. Main-
family SD units) are AA a^* , AA' d^* , and $A'A' - a^*$. Hence, taining more replicate lines or increa taining more replicate lines or increasing the number in the previous analysis, $a = a^* + d^*$. If the parents of of individuals from each family recorded for the quantithe *inter se* generation are a homozygote and a heterozy- tative trait, each generation, family size may make more gote, the calculations given in Equation 1 still apply. If efficient use of resources. Where reproductive rate limthe mating is between two heterozygotes, the probabili- its selection intensity, for example in mice, it might be ties that the individual selected for the next backcross increased by keeping two litters from each female or generation is *AA*, *AA'*, or *A'A'* are readily computed by by selecting only among males that have been given

cross parent is $A'A$ ²): eight generations of backcrossing with selection of the best individual from 12 recorded. The different models [*P*(*n*,*a** 1 *d**)]2 *P AA*(*n*,*a**,*d**) simulated represent different distributions of the QTL effects, ranging from $a_i = 0.2$ to 2, but with the same total difference in effect, $\Sigma_i a_i = 2$, between these chromosomes (as heterozygotes) from the recurrent and nonrecurrent backcross lines. The variances in the F2 can appear for two or more quite different distributions a heterozygous offspring is selected from the mating.
In Table 6, examples are given assuming that $n = 4$ cult to distinguish between one QTL and a pair of closely linked QTL (Haley and Knott 1992; Jansen 1993;

the probability that it is found in *m* of them is given by the Poisson distribution with parameter $M/2^t$. For $_{5%}$ (0.026, extending results of Table 2). Hence, in</sub> The greatest benefits from the *inter se* mating arise, such an experiment, applying a site-by-site type I error, of course, when the QTL of high value is recessive and further attention should be given to regions that are therefore neutral during the selection among back- found segregating in three or more lines. In an experi-

a^*	d^*	Prob: $t = 4$	Prob: $t = 8$	Rate of loss
$\bf{0}$	$\bf{0}$	0.0521	0.0033	0.5000(0.500)
		Dominant $(a = 2a^*)$		
0.125	0.125	0.1007	0.0119	0.4139(0.436)
0.25	0.25	0.1754	0.0351	0.3311(0.374)
0.5	$0.5\,$	0.3905	0.1658	0.1929(0.265)
1	$\mathbf{1}$	0.7869	0.6342	0.0525(0.126)
		Additive $(a = a^*)$		
0.125	$\bf{0}$	0.0803	0.0075	0.4464(0.468)
0.25	$\bf{0}$	0.1182	0.0160	0.3938(0.436)
0.5	$\bf{0}$	0.2242	0.0552	0.2955(0.374)
$\mathbf{1}$	$\bf{0}$	0.5052	0.2672	0.1472(0.265)
		Part recessive $(a = a^*/2)$		
0.125	-0.0625	0.0718	0.0060	0.4620(0.484)
0.25	-0.125	0.0969	0.0107	0.4234(0.468)
0.5	-0.25	0.1643	0.0296	0.3484(0.436)
$\mathbf{1}$	-0.5	0.3430	0.1237	0.2252(0.374)
		Recessive $(a = 0)$		
0.125	-0.125	0.0643	0.0048	0.4768(0.500)
0.25	-0.25	0.0800	0.0073	0.4507(0.500)
$0.5\,$	-0.5	0.1227	0.0166	0.3938(0.500)
$\mathbf{1}$	-1	0.2287	0.0558	0.2971(0.500)

Probabilities (Prob: *t***) that a QTL is retained with** *t* **of each of alternating generations of backcrossing** and *inter se* mating, with one individual of each sex selected from $n = 4$ recorded in each case.

The rate of loss of the QTL is given by $1 - \lambda$, where λ is the eigenvalue of the transition matrix C, and () gives the rate of loss for backcrossing alone with the same QTL effects, *i.e.*, *AA* a^* , *AA*^{4}, d^* , $A'A' - a^*$, with effect in the backcrossing generation $a = a^* + d^*$.

remaining segregating should be considered further. This does not take into account the multiple testing ability matrices such as **B** (Equation 6) or the methods problem, which is straightforward if all markers are on of Visscher and Thompson (1995) and by ignoring different chromosomes, or if the markers are essentially double recombinants. In any case, if the parental lines unlinked because they are widely separated on fewer differ in mean performance and if there is evidence of chromosomes; the Bonferroni correction can then be segregation variance in the initial backcross or an F_2 applied to give an experiment-wide error of specified of the lines, it is moot whether the genome-wide null value, albeit at the risk of considerable reduction in hypothesis of no effects is relevant. It might be more power. For example, taking 20 unlinked markers, one appropriate to assume an infinitesimal model (Visper mouse chromosome, the overall type I error if only scher and Haley 1996), with the variance distributed markers found segregating in four or more of 10 con-

equally among and within the chromosomes: it seems genic backcross lines are examined further is $\sim 8\%$ likely, however, since the net difference between the $(0.004 \times 20,$ from Table 2); more precisely, the probabil- two lines is therefore likely to be small around any ity that a locus remains segregating is $(1/2)^8$, and the probability that any of the 20 remain segregating is of each marker will be little higher than in the neutral $1 - [1 - (1/2)^8]^{20} = 7.5\%$. A more sophisticated analysis case unless the variance of aggregate effects among is required to find critical values when the distribution marker intervals is large. of chromosome lengths and actual position of markers It is possible, at least in principle, to estimate the are taken into account, but it is quite straightforward effects of a QTL located near a marker from the number to obtain genome-wide critical values such as those that of replicate lines in which it is segregating. Considering are used in QTL mapping from one-generation crosses first individual QTL, the expected proportion of lines (Lander and Botstein 1989), for example, by a permu-
tation test. It can be shown that for a chromosome be equated to the actual proportion m/M (this is the with *k* markers, the recombination fractions between maximum likelihood estimator). If there is no recombithe adjacent markers being $r_1, r_2, ..., r_{k-1}$, then the proba- nation between the marker and QTL, an estimate, \hat{a} ,

 $[-\Sigma (1-r_i)^t]$, a result obtained by using transition probof the lines, it is moot whether the genome-wide null marker, that the probabilities of continued segregation

be equated to the actual proportion m/M (this is the bility that at least one remains segregating is \sim (1/2) $'$ [k of the effect can then be obtained by trial and error,

1 QTL, $a = 2$ at 35 cM	2 QTL, $a = 1$ at 25, 45 cM	5 QTL, $a = 0.4$ at 15, 25, , 55 cM	10 QTL, $a = 0.2$ at 5, 15, , 95 cM
00000000000 \times 4 ^a	00000000000 \times 7	000000 0000 \times 5	00000000000 \times 13
00111000000	01111111111	00000100000	10001111111
00110000000	00111100000	00000001110	01111000000
00001000000	00001000000	00011100111	11111110000
11111000000	11100111111	00111111100	00111101100
00111000000	00111000000	00011111100	00000001110
00001110000	00000110000	11110000000	11111110000
01000000000	01111000000	01101110000	00100110000
00001000000	00111000000	00110000000	
00011000000	00000100000	11100000000	
00011100000	01111100000	10000000000	
00010000000	00111000000	11111100000	
00011000000	01001100000	11000000000	
00111000000	00011110001	11111000000	
01110000000		00000011000	
00111000000		00010000000	
00010000000			

Simulated examples of patterns of markers for different models of QTL distribution with the same total effect on a chromosome of length 100 cM, with 11 equally spaced markers at 0, 10, ..., 100 cM.

^a Number of occurrences of haplotype of recurrent parent. Results for other replicates are given in the ordered sampled. Boldface shows flanking markers for the QTL.

n 5 12, *t* 5 8 and *M* 5 20 lines. Symbols show the marker haplotype of selected individual; 11111111111 is the marker haplotype of the nonrecurrent and 00000000000 that of the recurrent inbred parent.

evaluating Equations 1 and 3. As an approximation, so the most likely QTL position is between markers *4 ia* $/2$ /2]^{*t*} = *m*/*M* or *a* = (2/*i*)[2(*m*/*M*)^{1/*t*} - 1]. Because *5*, the QTL (let us assume identified from phenotypes the estimate is obtained from a realization of the Poisson for the trait) was segregating error of the estimate is likely to be of the same size as cM) and the QTL, and five were recombinants between the estimate itself, which can be considered as no more the QTL and marker *5* (map position 40 cM). Hence, to combine the data on markers, but sampling errors of a QTL of very large effect retained segregating over will remain large. Information on the effect of the QTL many (eight) generations. More generally, the precision can also be obtained directly from segregation analysis will be a function of the number of lines in which the than those in which it is lost. Further precision can be **.** effective recombination rate being $1 - (1 - r)^t$. There

mation on single individuals in each family at the end tion rate. chromosome, and that the lines in which the QTL was

Equations 2 and 3 can be used together to give $[(1 + \text{ and } 5. \text{ Among the 18 lines segregating at markers } 4 \text{ or } 6. \text{ The total number of times per unit.}$ for the trait) was segregating at 17; of these 18 lines, nine distribution with a small parameter value, the standard were recombinants between marker *4* (map position 30 than a guide. The estimate also has to be corrected for the maximum likelihood estimate of QTL position can recombination between the marker and the QTL. In be shown to be at 36.7 cM, close to its actual position principle, but beyond the scope of this paper, interval at 35 cM. The precision was achieved by typing solely mapping (Lander and Botstein 1989) could be used 20 genotypes, but obviously, this is an extreme example within the backcross families at the end of the backcross- QTL remains segregating, those in which it and the ing phase, those retaining a QTL of large effect having markers are lost providing none, and the number of both higher mean and higher within family variance generations for which backcrossing is continued, the obtained by typing progeny for the marker(s) near the is, however, a trade-off because increasing the number putative QTL. **only as a contract of generations leads to a reduction in probability of** \mathbf{q} A QTL can be mapped solely using the marker infor- segregation and an increase in the effective recombina-

of the backcrossing phase. Consider the example in the It would be possible to obtain more information about first column of Table 7, and assume, as was actually the QTL positions and effects if the marker screening were model simulated, that there was only one QTL on the conducted during the backcrossing program, and this chromosome, and that the lines in which the QTL was would also enable decisions to be made as to when to segregating could be identified from their mean and cease backcrossing to optimize the trade-off between variance. In the 20 replicate lines, markers *1*, *2*, ..., *7* recombination and loss of QTL. The records of individwere segregating in, respectively, 1, 3, 7, 12, 11, 2, and ual animals forthe quantitative trait and foreach marker 1 lines, and none of markers *8–10* remained segregating, can be combined to provide further information using

feasible using Markov chain Monte Carlo methods, such testing of recombinants can be used to make this proceas Gibbs sampling, and have been used in an analysis dure more accurate (P. D. Keightley, personal commuof recurrent backcross lines in which a set of different nication). marker regions were maintained segregating (Rance *et* For precise mapping of QTL, opportunity is needed *al.* 1997). The simple scheme analyzed here, in which for substantial recombination between linked QTL and *al.* 1997). The simple scheme analyzed here, in which marker information is collected only at the end, is more between them and markers. The advantage of multiple appropriate for laboratory species with short generation generation schemes is that, in effect, recombination intervals than for commercial animal or crop species. fractions are increased roughly in proportion to the In such cases, it is likely to be preferable to collect number of generations, and similarly, the average marker data each generation, and perhaps to also length of chromosome retained around a marker is choose individuals for backcrossing on their marker reduced in inverse proportion to the number of genera-
genotype as well as on phenotype for the trait of interest. Itions. The method discussed here has advantages and genotype as well as on phenotype for the trait of interest. tions. The method discussed here has advantages and
This leads to more complicated design and interpreta-
disadvantages over others for QTL location. In the most tion problems than are discussed here. conventional, QTL are mapped by recording pheno-

should not matter greatly whether a male or female is line cross. An additional experiment is subsequently selected for the next generation of backcrossing. If, required to isolate these further, which can involve inhowever, QTL on the sex chromosome are to be located, trogression or retention of marked segments by backthen females should obviously be selected in the back- crossing; this contrasts with the backcrossing with seleccross line; if map lengths in females are greater than tion proposed here in that it is the markers that are in males, there is an added benefit in doing so. There identified in the backcrossing rather than the phenoare other practical issues that have not been considered. types. Even so, a number of lines have to be retained For example, there is a risk that the selected individual for each QTL because the precise relation between in a line is infertile or that none of the required sex marker and QTL position is not known. The use of are available for selection. In such cases, it may be appro- markers, however; has the benefit that QTL of smaller priate to initiate many more lines than are expected to effect can be retained, and as marker and trait data be maintained, or to sacrifice the simplicities of having are collected throughout, information on the location completely independent backcross lines by drawing sub- accumulates during the backcrossing phase, but at the lines from surviving lines to maintain numbers. The expense of a lot of recording, compared to backcrossing analysis can be clearly developed further. with selection on the trait. An alternative approach is

one line, QTL that are recessive in the nonrecurrent tions of the cross, for example, $F_3, F_4,...$, before undertakparent will be missed. Although alternating backcross- ing the QTL analysis; however, this may still require ing and *inter se* mating alleviates this problem, net selec- backcrossing to establish congenic lines for gene clonselection in two reciprocal sets of lines, differing in would be lost.) A further alternative for multigeneration which is used as the recurrent parent. The probability analysis is the use of selected lines and identification that the QTL is maintained segregating in each type of of QTL, preferably replicated by changes in marker line and over the whole set can readily be computed frequencies between high and low lines (Keightley from the methods given here. and Bulfield 1993); however, this still requires subse-

this and other studies (*e.g.*, N. J. Schork, A. M. Beebe, precise mapping and cloning. B. Thiel, P. St. Jean, and R. L. Coffman, unpublished The objective of this paper is not to show that the data) on the use of recurrent backcrossing paper is use of recurrent backcrossing with selection with several essentially a prescreening procedure for QTL detection, independent single family backcross lines is optimal in not a finishing point. When the recurrent backcrossing any broad way. It is indeed clear that if more effort were with selection on phenotype for the quantitative trait is expended on recording markers during the backcrosscompleted, and regions of the genome which the ing phase and associating them with performance of marker analysis indicates that QTL for the trait are likely the trait, and perhaps using this information to generate to be present, more detailed analysis is needed; the sublines on a dynamic basis, further precision could be congenic lines, however, provide a useful starting point. obtained; the analysis of such a scheme, however, is For example, further backcrossing can be practiced beyond the scope of this paper. The aim is merely to while maintaining segregating-only specific short marker suggest a method with relatively low input of effort that intervals. Segregation within the families and QTL and may lead to fairly clear identification of QTL of large marker recording can be undertaken to confirm QTL effect and simultaneous production of congenic lines

maximum likelihood methods that are computationally effects and more closely map their position. Progeny

disadvantages over others for QTL location. In the most If only QTL on autosomes are to be identified, it types and marker genotypes in an F_2 or backcross of a With recurrent backcrossing and selection to only to proceed to QTL mapping of more advanced generative pressures on recessives remain small. An alternative, ing. (Recurrent backcrossing rather than *inter se* mating if both lines are inbred, is to practice backcrossing and is not feasible without selection because most QTL It is important to note that the method discussed in quent backcrossing if congenic lines are needed for

that may be useful for further, more detailed analysis. Haley, C. S., and S. A. Knott, 1992 A simple regression method
The idea of backcrossing with selection is old indeed, Hill, W. G., 1969 On the theory of artificial se and its successful use to identify QTL for disease resis-

tance has been reported (Beebe et al. 1997) The only Houwen, R. H. J., S. Baharloo, K. Blankenship, P. Raeymaekers, tance has been reported (Beebe *et al.* 1997). The only Houwen, R. H. J., S. Baharloo, K. Blankenship, P. Raeymaekers,
novelty is in the use of independent sublines and the subsequents: mapping a gene for benign recurrent quantification of the probabilities that QTL are re-

tained N.J. Schork A.M. Boobe, B. Thiol. P. St. Joan Jansen, R. C., 1993 Interval mapping of multiple quantitative loci. tained. N. J. Schork, A. M. Beebe, B. Thiel, P. St. Jean Jansen, R. C., 1993 Interval mapping of multiple quantitative local mapping of multiple and R. L. Coffman (unpublished data) discuss methods Keightlev, P. D., and G. for analysis of nonindependent backcross lines with seral that loci from frequency changes at marker loci under selection.
Iection and use of markers.
I am grateful to Philippe Baret. Peter Keight lev. Sara Knott. The sele

I am grateful to Philippe Baret, Peter Keightley, Sara Knott,

Peter Visscher, Zhao-Bang Zeng, and two anonymous referees for

helpful comments, and to the Biotechnology and Biological Sciences

Research Council for financ

- Alpert, K. D., and S. D. Tanksley, 1996 High-resolution mapping
and isolation of a yeast artificial chromosome containing fw2.2:
a major fruit weight quantitative trait locus in tomato. Proc. Natl.
Acad. Sci. USA **93:** 155
-
- Beebe, A. M., S. Mauze, N. J. Schork and R. L. Coffman, 1997 Serial and the resistance to

backcross mapping of multiple loci associated with resistance to

Leishmania major in mice. Immunity 6: 531-537.

Charlier, C., F.
-
-
-
- Falconer, D. S., and T. F. C. Mackay, 1996 *Introduction to Quantita-* Zeng, Z.-B., 1993 Theoretical basis for separation of multiple linked
- Guo, S. W., 1995 Proportion of genome shared identical by descent by relatives: concept, computation and applications. Am. J. Hum.
Genet. 56: 1468-1476.
-
-
-
-
- Keightley, P. D., and G. Bulfield, 1993 Detection of quantitative
trait loci from frequency changes at marker loci under selection.
-
-
- Ollivier, L., L. A. Messer, M. F. Rothschild and C. Legault, 1997 The use of selection experiments for detecting quantitative trait loci. Genet. Res. **69:** 227–232.
- Rance, K. A., S. C. Heath and P. D. Keightley, 1997 Mapping LITERATURE CITED quantitative trait loci for body weight on the X chromosome
	-
	-
	-
	-
- val. Mamm. Genome 8: 163–167.

Démant, P., and A. A. M. Hart, 1986 Recombinant congenic

trains— a new tool for analyzing traits determined by more than

one gene. Immunogenetics 24: 416–422.

District, W. F., J. Miller, R
- Boles et al., 1996 A comprehensive genetic map of the mouse in *Quantitative Inheritance*, edited by E. C. R. Reeve and C. H. genome. Nature 380: 149-152. genome. Nature **380:** 149–152.
Waddington. Her Majesty's Stationery Office, London, UK.
Zeng, Z.-B., 1993 Theoretical basis for separation of multiple link
	- gene effects in mapping quantitative trait loci. Proc. Natl. Acad. Sci. USA **90:** 10972-10976.

Communicating editor: Z-B. Zeng