# DO HARVEST REFUGES BUFFER KANGAROOS AGAINST EVOLUTIONARY RESPONSES TO SELECTIVE HARVESTING? 

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#### Abstract

There is a wealth of literature documenting a directional change of body size in heavily harvested populations. Most of this work concentrates on aquatic systems, but terrestrial populations are equally at risk. This paper explores the capacity of harvest refuges to counteract potential effects of size-selective harvesting on the allele frequency of populations. We constructed a stochastic, individual-based model parameterized with data on red kangaroos. Because we do not know which part of individual growth would change in the course of natural selection, we explored the effects of two alternative models of individual growth in which alleles affect either the growth rate or the maximum size. The model results show that size-selective harvesting can result in significantly smaller kangaroos for a given age when the entire population is subject to harvesting. In contrast, in scenarios that include dispersal from harvest refuges, the initial allele frequency remains virtually unchanged.


Key words: body size; environmental stochasticity; genetic effects; harvest refuge; individualbased model; kangaroo; Macropus rufus; size-selective harvesting.

## Introduction

Changes in body size in response to selective harvesting are of great interest and there are several models of the underlying mechanisms of this phenomenon. Ratner and Lande (2001) review empirical and theoretical work in this area and summarize the mechanisms proposed to explain observed changes in body size in harvested populations. They identify three categories of possible mechanisms: (1) abiotic factors influencing fish growth and development, e.g., large-scale ocean regime shifts that change water temperature, salinity, or eutrophication; (2) biotic factors, including relaxing density-dependent effects on growth due to changes in the population density; and (3) effect of harvesting on population demography and genetics. Their review concentrates on marine and freshwater organisms, but applies generally to harvested animals.

Among terrestrial animals, "trophy" species, such as the Saiga antelope (Saiga tatarica), elephants, moose, or elk, are selectively harvested because antlers or tusks have a higher value than animal meat. Theoretical work on moose (Alces alces) (Hundertmark et al. 1993) and elk (Cervus elaphus) (Thelen 1991) suggests that selective harvesting of bulls with a minimum antler length can change the frequency of alleles favoring antler growth. There is also empirical evidence for the potential of selective harvesting to influence the distribution of traits. For example, in South Luangwa

[^0]National Park in Zambia, the proportion of tuskless elephants (Loxodonta africana) increased from $11 \%$ to $38 \%$ in only 20 years due to ivory poaching (Jachmann et al. 1995).

Changing allele frequencies in terrestrial species has important implications for conservation managers as well. For example, sanctuaries for endangered species are occasionally so successful that managers are forced to control population density through translocations or culling (e.g., Sukumar 1991, Armbruster and Lande 1993, Chapman et al. 1998, Treydte et al. 2001). In this case, potential indirect genetic effects of "harvesting" cannot be ignored.

In Australia there is increasing concern about the possible consequences of selective harvesting of kangaroos (Croft 1999). This paper uses a stochastic simulation model to explore the impact of harvesting on potential genetic controls of growth and survival in kangaroos. The results are directly relevant to the specific issue of kangaroo management. Management strategies can influence harvesting rate, minimum size of the target animal, and the size and location of harvest refuges. We also use the model to make more general comments on the evolutionary impact of size-selective harvesting in a stochastic environment.

Selective harvesting can alter the pattern of age- or size-specific mortality, which also can produce evolutionary change in life history and morphological traits (Miller 1957, Handfort et al. 1977, Ricker 1981, Wohlfarth 1986, Nelson and Soulé 1987, Edley and Law 1988, Law 1991, Policansky 1993, Rijnsdorp 1993, Murphy et al. 1994, Hutchings 1999). Models exploring the evolutionary dynamics of body size under harvesting often make the simplifying assumption that harvesting is the only source of selection on size (Law

1991, Law and Rowell 1993). Ratner and Lande (2001) criticize these assumptions because most populations experience natural selection with respect to polygenic (quantitative) morphological traits. In their view, "stabilizing viability selection and directional fecundity selection on size traits interact with size-selective harvesting, and models that omit these interactions may produce incomplete or misleading results." Our model therefore includes increased mating success for larger males and reduced survival in drought as other sources of selection on body size.

Theoretical work usually considers harvesting strategies that differ in their degrees of size selectivity, i.e., a range of minimum sizes (Law 1991, Law and Rowell 1993). In fish the minimum size is often determined by the mesh size of the fishing nets, and fish above that size have the same probability of being caught regardless of population density. In terrestrial animals, the size selectivity is more complex. The minimum size is usually dictated by economic factors or regulations, but the probability of harvesting an individual depends on the population density and the individual's size relative to the size of other animals. If the population density is low, it takes harvesters a long time to find an animal; consequently, they harvest it as long as it is above the minimum marketable size. With increasing population density, the encounter rate increases and harvesters become more selective because large animals are often more valuable and there is usually a limit to the number that can be harvested in a single foray (e.g., vehicle size). Such capacity effects also have the potential to affect size selectivity in marine systems (Gillis et al. 1995a, b).

In this paper, one of the primary questions is how dispersal of individuals from a nonharvested area (a refuge) may counteract the genetic impact of size-selective harvesting. There is a growing interest in the role of marine reserves to conserve the genetic viability and identity of marine stock (Trexler and Travis 2000, Conover and Munch 2002). Such systems can be described as source-sink metapopulations, in which the refuge population acts as source and the harvested population as sink. Theoretical work (e.g., Wootton and Bell 1992, Donovan et al. 1995, Dias 1996, Gaona et al. 1998) suggests that metapopulations with at least one source population have a lower probability of extinction. Thus, we can expect that harvest refuges will increase the demographic viability of the kangaroo population. The existence of harvest refuges in the kangaroo system and their potential effect on demographic and genetic viability depend on the spatial variability in harvest and the mobility of kangaroo populations.

The maximum annual rate of kangaroo harvesting is determined by state conservation agencies and is a quota for an entire state. The annual quota varies between $15 \%$ and $20 \%$ of the statewide population estimated with harvest-independent surveys. However, harvesting is usually concentrated in some areas whereas oth-
ers are not harvested at all because of differences in accessibility and the location of refrigeration units for carcass storage. This spatial variation in harvesting rates implicitly creates harvest refuges, which may replenish kangaroo abundance in the harvested areas (Pople 1996). It is reasonable to assume that only natural selection influences kangaroo populations in refuge areas.

Whether or not spatial variability in harvest actually improves the demographic and genetic viability of a harvested population depends on the movement rates between harvested and nonharvested areas (Trexler and Travis 2000). If movement rates are too low, the two areas will function as independent populations, and both natural and artificial selection will lead to genetic divergence. If movement rates are too high, the two areas effectively become one, and there also will be no genetic benefit to harvest refuges. Kangaroos, particularly red kangaroos (Macropus rufus), are in general very mobile (Frith 1964, Bailey 1971, Denny 1980, Priddel 1987, Priddel et al. 1988a, b, Croft 1991, Norbury et al. 1994). The majority of the population does not move more than $10 \mathrm{~km} / \mathrm{year}$, but some individuals disperse over distances of tens or hundreds of kilometers. Exactly where this places kangaroos on the scale of movement effects on genetics just described is unclear, so in what follows, we explore the sensitivity of our results to a broad range of movement rates.

This paper describes a model of the genetic consequences of selective harvesting on the frequency of genes determining kangaroo body size and survival in droughts. Analytical quantitative genetic models usually assume a normal phenotype distribution, random mating, and constant genetic variance (Lande 1976, Falconer and Mackay 1996, Ratner and Lande 2001). In many biological systems these assumptions are violated. Our model is a stochastic, individual-based simulation model that allows us to consider more complex scenarios that would not be feasible in an analytical model. Comprehensive stochastic computer simulations are increasingly used to test predictions of analytical models (e.g., Bürger 1999, Reeve 2000). The results of the model suggest that size-selective harvesting results in a higher frequency of genotypes with smaller asymptotic size or growth rate, in agreement with other models of size-selective harvesting (e.g., Law 1991, Law and Rowell 1993, Ratner and Lande 2001). If there is dispersal from refuge populations, the initial gene frequency remains virtually unchanged. This model is tailored to red kangaroos, but we believe that the predictions would apply to a variety of other species living in arid environments, such as the African savannah or the Arabian Peninsula.

## Model Overview

In the literature there are numerous attempts to model the population dynamics of kangaroos as a function of rainfall, resource availability, density dependence, and
environmental stochasticity (see review in Cairns 1989, McCarthy 1996). Our objective is not to create a complex model of population dynamics as it relates to the environment, but to evaluate the potential for evolutionary change as a result of size-selective harvesting. Thus we ignore interspecific competition (e.g., with sheep) and the interactions of pasture growth and kangaroo performance. Instead, we use rainfall as a surrogate for resource availability. Large kangaroos are gregarious; the only permanent grouping is between a female and her dependent young-at-foot (Jarman and Coulson 1989). Although relatively large groups sometimes form, these groups are unstable in their composition (Croft 1980). In the interests of keeping the model from becoming too complex, we ignore smallscale group structure in our model.

The model includes demographic and environmental stochasticity. Demographic stochasticity means that at any point in time there is a probability that an individual dies or reproduces. The random nature of sex determination of offspring is also included. Environmental stochasticity enters the model through rainfall. Rainfall strongly influences the population dynamics of arid-zone kangaroos through food availability. The population size fluctuates to a great extent as a consequence of including environmental stochasticity in the model.

The model is individual based, and therefore each individual is tracked as a unique and discrete entity. Individual-based modeling is a widely used tool for simulating ecological systems (see review in Grimm 1999, Grimm et al. 1999), especially for models where individual variability is critical for the population dynamics. Our model keeps track of the individual properties of age, size, sex, and genotype. At every time step ( $=$ two months), the model cycles over lists of males and females and determines the fate of each individual. The different population processes occur in the following sequence:

1. Rainfall.-At the beginning of each year the annual rainfall is determined by randomly drawing a number from historical rainfall data that have been collected for 123 years at Menindee (near Kinchega National Park) in western New South Wales, Australia. This parameter is treated as an indicator for the availability of resources, such as food and water, for the whole year.
2. Harvesting.-In our model, harvesting starts 100 years after the beginning of a simulation run, to allow the gene frequencies and age distributions to approach equilibrium. At the beginning of each year, the number of kangaroos to be harvested is calculated from the kangaroo density of the previous year and the harvesting quota. Individuals are chosen randomly from male and female lists and are exposed to harvesting. The probability of being shot depends on the size of the chosen kangaroo and overall kangaroo abundance.
3. Mating and reproduction.-Each female without a pouch young mates and gives birth to a pouch young
with probability $f$; the sex is assigned randomly with a sex ratio of $1: 1$. The father of the offspring is determined in two steps: first, the female encounters a male chosen randomly from the list of mature males, and second, the probability that this male successfully mates with the female depends on his size relative to all other males. Both successful and unsuccessful males go back to the list and may be selected again. This process is repeated until the female is successfully mated. It is possible that a male can have more than one opportunity to mate with a particular female, and sometimes even very small males will mate successfully. Newborn kangaroos can die at birth; the probability of death increases with increasing kangaroo abundance.
4. Natural mortality, aging, and growing.-At each time step there is a chance that an individual will die. If a female dies, her dependent offspring die with her. The surviving individuals age by one time step and increase in size. Based on its new age, an individual may move up one stage class. For example, at the age of 8 months, pouch young turn into "young-at-foot," and at the age of 12 months, young-at-foot turn into subadults. New subadults are independent of their mother and, depending on their sex, they are added to female or male lists. Whether female subadults reach maturity depends not only on age, but also on their size and the amount of rainfall.
5. Dispersal.-At every time step some individuals move between harvested and nonharvested populations. Dispersing individuals from the refuge population replace harvested individuals to some extent and increase the genetic variability of the harvested population.

Note that processes (1) and (2) occur only every sixth time step.

## Model Assumptions

We use the following notational conventions in what follows: $i$ and $j$ index individuals in a population, and $i$ usually refers to a "focal" individual, whereas $j$ is used in summations over entire populations; $y$ is size, $z$ is sex, and $x$ is age in time steps; $\mu$ is a probability of dying during a time step; $p$ is always a probability of an event occurring during a single time step, and the subscript identifies the event. All model parameters are listed in Table 1, and the estimation of the parameters is described in Appendix A.

## Sex ratio

In large, sexually dimorphic, polygynous mammals such as kangaroos, the variance in the reproductive success of males is greater than in females. Current theory suggests that in these animals, a mother that is in good condition should preferentially conceive sons and provide them with above-average parental care, and a mother that is in poor condition should preferentially conceive daughters and provide them with be-low-average parental care (Trivers and Willard 1972,

TABLE 1. Base value of model parameters, and the probability distribution functions (PDF) used in the sensitivity analysis.

| Parameter |  | Conditions | Base value | PDF $\ddagger$ |
| :---: | :---: | :---: | :---: | :---: |
| Description | Symbol $\dagger$ |  |  |  |
| Maturity |  |  |  |  |
| Intercept | $w_{0}(3)$ |  | 1.137 | normal (1.137, 5) |
| Weight | $w_{1}(3)$ |  | 0.653 | normal (0.653, 0.14) |
| Age | $w_{2}(3)$ |  | -8.298 | normal ( $-8.298,3.4$ ) |
| Rain | $w_{3}(3)$ |  | -0.046 | normal ( $-0.046,0.016$ ) |
| Age : rain | $w_{2,3}(3)$ |  | 0.033 | normal (0.033, 0.01) |
| Male bias in birth | $\alpha$ |  | 0.5 | beta (12, 5) |
| Male dominance | $v$ (4) |  | 5 | gamma (5, 1) |
| Birth rate | $f$ |  | 0.95 | beta ( 40,2 ) |
| Dispersal |  |  |  |  |
| From harvested to nonharvested | $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}(13)$ |  | 0.001 | gamma (2, 400) |
| From nonharvested to harvested | $\varepsilon_{\mathrm{NH} \rightarrow \mathrm{H}}(14)$ |  | 0.001 | gamma (3.5, 150) |
| Male bias | $\theta$ |  | 0.6 | beta ( 6,4 ) |
| Mortality |  |  |  |  |
| Age | $\rho$ (5) | age $<x^{*}$ | $0.05 \S$ | gamma (60, 1600) |
|  |  | age $\geq x^{*}$ | 0.058 | gamma (60, 1600) |
|  | $\kappa(5)$ | age $<x^{*}$ | $0.3 \S$ | gamma (10, 33) |
|  |  | age $\geq x^{*}$ | 108 | normal (10, 1) |
|  | $x^{*}$ |  | 14 | normal (14, 1.5) |
| Rainfall | $\mu_{0}(8)$ | males | 0.5 | beta ( 12,12 ) |
|  |  | females | 0.55 | beta (14.5, 12) |
|  |  | young | 0.2 | beta (2, 14) |
|  | $b$ (7) | males | 0.01 | gamma (10, 1000) |
|  |  | females | 0.01 | gamma (10, 1000) |
|  |  | young | 0.014 | gamma (20, 1430) |
| Density dependence Genes | $\omega$ (9) | young only | 0.001 | beta ( 4,3000 ) |
|  | $m$ (C1) \|| |  | 0.085 | gamma (4, 47) |
|  | $d$ (C1)\|| |  | 0.009 | gamma (4, 444) |
| Growth |  |  |  |  |
| Age | $y_{\infty}(10)$ | malesfemales | 190 | normal (190, 10) |
|  |  |  | 160 | normal (160, 10) |
|  | $c$ (10) | males | 0.25 | beta (20, 60) |
|  |  | females | 0.47 | beta ( 45,50 ) |
|  | $x_{0}(10)$ | males | -3.4 | normal ( $-3.4,0.3$ ) |
|  |  | females | -2 | normal ( $-2,0.3$ ) |
| Rainfall | $\begin{aligned} & g(12) \\ & h(12) \end{aligned}$ |  | $\begin{aligned} & 1.2 \\ & 0.015 \end{aligned}$ | $\begin{aligned} & \text { gamma }(20,17) \\ & \text { gamma }(10,666) \end{aligned}$ |
| Genes | $\begin{aligned} & \sigma_{\text {growth, } 1} \\ & \sigma_{\text {growh }, 2} \end{aligned}$ | $\begin{aligned} & \text { genes } \rightarrow y_{\infty} \\ & \text { genes } \rightarrow c \end{aligned}$ | 8 | normal ( $8,1.5$ ) |
|  |  |  | 0.05 | normal (0.05, 0.01) |
| Harvesting | $k$ (1) |  | 0.0001 | normal (0.0001, 0.00003) |
| Mortality rate | $\begin{aligned} & \mu_{\text {harvest }}^{\phi(1)} \end{aligned}$ |  | 0.5 | normal (0.5, 0.2) |
| Minimum size | $y_{\text {min }}$ |  | $142 \mathrm{~mm}(\approx 25 \mathrm{~kg})$ | normal ( 25,5 ) |
| Quota | $q$ |  | 0.15 ( | normal (0.15, 0.03) |

$\dagger$ Numbers in parentheses indicate the equation in which the parameter is used.
$\ddagger$ Numbers in parentheses are the parameters of the PDF used in the sensitivity analysis.
§ Parameters that were varied independently for both sexes in the sensitivity analysis.
$\|$ Eq. C. 1 in Appendix C.

Maynard Smith 1980). In the empirical literature, there is mixed support for this theory. Some researchers found that the sex ratio of newborns varies with environmental conditions (kangaroos; Johnson and Jarman [1983]), maternal age, social rank, and body condition (red deer; Clutton-Brock et al. [1982]; rednecked wallabies Macropus rufogriseus and eastern grey kangaroos M. giganteus; Stuart-Dick and Higginbottom [1989]). In contrast, in an extensive study over
three years on red kangaroos M. rufus ( $n>2000$ ), Pople (1996) detected little sex bias in pouch young and no relationship between pouch young sex and maternal age or condition.

For reasons of parsimony, we assume in our model that environment and size do not affect the sex ratio. It is unlikely that variation in the sex ratio would change the model predictions notably because under size-selective harvesting, the largest individuals of
each sex are killed, resulting in natural selection favoring smaller individuals.

## Harvesting

In the model we assume that a given proportion, $q$, of the kangaroo population is harvested each year. Based on $q$ and the kangaroo abundance, $n$, the number of harvested individuals ( $=$ target) is calculated and individuals are removed randomly at the beginning of each year. In the model we assume the following scenario: If a shooter encounters a group of animals (s)he usually shoots the largest one first and the other animals in the group escape. Group size is bigger when kangaroo abundance is larger, and at very low density, only solitary animals are encountered. Therefore, the probability of a kangaroo surviving harvest, $1-\mu_{\text {harvest }}$, depends on its size relative to the size of the other kangaroos, and kangaroo abundance, and is calculated as follows:

$$
\mu_{\text {harvest }, i}= \begin{cases}0 & \text { if } y_{i}<y_{\min }  \tag{1}\\ \phi \frac{y_{i}^{k n^{2}}}{\sum_{j} y_{j}^{k n^{2}}} & \text { if } y_{i} \geq y_{\min }\end{cases}
$$

where $y_{i}$ is the size of kangaroo $i, \phi$ is a scaling constant to adjust for different harvesting pressure, $n$ is the abundance of adult and subadult kangaroos, and $k$ is an index determining how size-selective harvesters are. With increasing $n$, the selectivity for bigger animals increases, and if $k n^{2}$ is close to 0 , all animals above the minimum size, $y_{\text {min }}$, have an equal probability of being shot. We use $n^{2}$ rather than $n$ to increase the effect of abundance on $\mu_{\text {harvest }}$.

To determine which animal is harvested and removed from the population, we randomly choose males and females from the population. Chosen individuals are "shot" with the probability $\mu_{\text {harvess }}$, and are removed from the population. If a female is shot, all of her dependent young die with her. However, the young are not counted toward the harvesting target. Surviving individuals remain in the population. Individuals can be chosen more than once and there is a chance that relatively small individuals will be harvested. The random selection process continues until the target quota proportion $q$ of the current population has been harvested.

## Reproduction

In the model, the probability that a female will reach maturity, $p_{\text {mature }}$ depends on her age $(x)$, size ( $y$ ), and the current rainfall $(R)$, and is given by

$$
\begin{align*}
p_{\text {mature }}(y, x, R) & =\frac{e^{\mathrm{lp}}}{1+e^{\mathrm{lp}}}  \tag{2}\\
\mathrm{lp} & =w_{0}+y_{i} w_{1}+x w_{2}+R w_{3}+x R w_{2,3} \tag{3}
\end{align*}
$$

where lp is the linear predictor.
We have no data to estimate the probability of maturation for males. Therefore, we assume that males
randomly mature between 2.5 and 3.5 years. For males, the timing of maturity has only a small influence on fitness because males less than 4 years old are relatively small in size compared to the rest of the male population and, consequently, have a very low probability of mating.

The probability that male $i$ will mate successfully after encountering a female, $p_{\text {mating }}(y, v)$, is given by

$$
\begin{equation*}
p_{\text {mating }}(y, v)=\frac{y_{i}^{v}}{\sum_{j} y_{j}^{v}}, \quad v \geq 0 \tag{4}
\end{equation*}
$$

where $y_{\mathrm{i}}$ is the size of kangaroo $i$, and the summation is over all mature males, and $v$ determines how much the relative size of individual $i$ influences mating success. For $v>1$, the influence is large; for $0<v<1$, the influence is small; and for $v=0$, the mating success is independent of size.

## Mortality

The natural mortality depends on age, sex, and rainfall (Frith and Sharman 1964, Newsome 1965, Bayliss 1985, Shepherd 1987, Pople 1996). For very young animals, there is an additional independent mortality event, the probability of which is a function of total population abundance. Independence means that surviving one phase does not alter the probability of dying in a later phase. The mortality probability that we calculate, $\bar{\mu}_{R, x, z}$, where $R$ is the annual rainfall for the current year, $x$ is the age of the individual, and $z$ is the sex, is the average across the genetic variation in the population; the mortality probability for a particular individual also incorporates the effect of its genome (see Genetics).

We use a Weibull function (McCallum 2000) to include the effect of age on the instantaneous death rate. The age-specific death rate at age $x$, also known as the hazard function in the survival literature, is

$$
\begin{equation*}
\kappa \rho(\rho x)^{\kappa-1} \tag{5}
\end{equation*}
$$

where $\rho$ is the rate and $\kappa$ is the shape parameter. If $\kappa$ $>1$, the death rate increases with age; if $\kappa<1$, the death rate decreases with age. When $\kappa=1$, the death rate is a constant and the distribution of survival times reduces to the exponential distribution. By changing $\kappa$ for first part of the age range, we can let the instantaneous death rate decrease with age as a result of increasing experience (e.g., habitat selection), and during the last part of the age range, we can let the instantaneous death rate increase as a result of senescence, where $x^{*}$ is the age in years at which senescence starts affecting survival.
The model uses discrete time steps, so we calculate the probability of dying from age $x$ to $x+1$ when rainfall is not limiting (i.e., $R=\infty$ ), $\bar{\mu}_{\infty, x, 2}$, from Eq. 5:

$$
\begin{align*}
\bar{\mu}_{\propto, x, z} & =1-\exp \left[-\int_{x}^{x+1} \kappa \rho(\rho u)^{\kappa-1} d u\right] \\
& =1-e^{(\rho x)^{\kappa}-[\rho(x+1)]^{\kappa}} . \tag{6}
\end{align*}
$$

where $u$ is a temporary integration variable.
In general, the survival probability of females is higher than that of males, and the survival probability of pouch young and young-at-foot is lower than that of adults. Survival in juveniles is lowest in late pouch life and among young-at-foot (Frith and Sharman 1964, Newsome 1965, Shepherd 1987, Pople 1996). In the model, we therefore assume that, given the mother stays alive, young only die of natural causes at 5-12 months of age (i.e., $\bar{\mu}_{R, x, z}=0$ for $x<5$ months). This limits females to attempting to rear a maximum of three offspring each year.

We assume that rainfall causes mortality to decrease from an upper limit $\left(\bar{\mu}_{0, x, z}\right)$ to a lower limit when rainfall is not limiting (Eq. $6 ; \bar{\mu}_{\infty, x, z}$ ) along a logistic curve (McCallum 1995):

$$
1-\mu_{R, x, z}=\left(1-\mu_{\infty, x, z, z}\right)\left(\frac{e^{a_{x, 2}+R b_{x, z}}}{1+e^{a_{x, z}+R b_{x, z}}}\right)
$$

or

$$
\begin{equation*}
\mu_{R, x, z}=\frac{1+\mu_{\infty, x, z} e^{a_{x}+R b_{x}}}{1+e^{a_{x}+R b_{x}}} \tag{7}
\end{equation*}
$$

where $b_{x, z}$ determines the slope (the estimation of this parameter is described in Appendix A), and $a_{x, z}$ is related to the maximum mortality $\left(\mu_{0, x, z}\right)$ by the following relationship:

$$
\begin{equation*}
a_{x, z}=\ln \left(\frac{\mu_{0, x, z}-1}{\mu_{\infty, x, z}-\mu_{0, x, z}}\right) . \tag{8}
\end{equation*}
$$

This means that, in years of high rainfall, kangaroos experience the lowest mortality ( $\mu_{\infty, x, z}$ ) probability for a given age and sex, but with decreasing annual rainfall, the mortality increases to $\mu_{0, x, z}$. How much the mortality increases depends on the degree of drought resistance (see Genetics and Appendix B).

Pouch young and young-at-foot experience a second independent mortality event, the density-dependent phase, in which mortality rates depend on the abundance of the kangaroo population. In our model, the densitydependent mortality of juveniles, $\mu_{n}$, increases exponentially with kangaroo abundance, $n$, at rate $\omega$ :

$$
\begin{equation*}
\mu_{n}=1-e^{-\omega n} . \tag{9}
\end{equation*}
$$

## Growth

In our model we used head length as a surrogate of kangaroo size. We used head length rather than mass because head length cannot decrease as a result of unfavorable environmental conditions. Head length also continues to increase well after maturity and to a greater extent than limb measurements such as pes length (Ealey 1967). We modeled growth of head
length with the von Bertalanffy equation (Koojiman 1993):

$$
\begin{equation*}
y_{x}=y_{\infty}\left[1-e^{-c\left(x-x_{0}\right)}\right] \tag{10}
\end{equation*}
$$

where $y_{x}$ is the head length of an individual at age $x$, $y_{\infty}$ is the asymptotic head length, $c$ is a growth rate, and $x_{0}$ is a shift parameter to allow head length at age 0 to be greater than zero. It is straightforward to rearrange Eq. 10 into a form that estimates the increment of growth over a single time step starting from size $y_{t}$ (McCallum 1995):

$$
\begin{equation*}
\Delta y=\left(y_{\infty}-y_{t}\right)\left(1-e^{-c}\right) \tag{11}
\end{equation*}
$$

Growth is also influenced by rainfall, $R$, and the growth increment is reduced by a fraction:

$$
\begin{equation*}
\Delta y_{R}=\Delta y\left(1-g e^{-h R}\right) \tag{12}
\end{equation*}
$$

where $g$ and $h$ are parameters determining the shape of the exponential curve. Under good conditions, individual growth follows the von Bertalanffy growth equation ( $\Delta y_{R} \rightarrow \Delta y$ ), but with decreasing rainfall, the growth slows down and reaches zero in severe droughts $\left(\Delta y_{R} \rightarrow 0\right)$. For a small number of the extreme parameter combinations in the sensitivity analysis, Eq. 12 leads to small negative growth increments under the most severe drought conditions used in the model (annual rainfall $<55 \mathrm{~mm},<1 \%$ of years). In these circumstances, the growth increment was rounded to zero.

## Dispersal

Refuge and harvested populations undergo the same population processes and are affected by the same environmental conditions (i.e., rainfall). At every time step, individuals disperse from the refuge population (NH) to the harvested population (H) and vice versa. We assume that this movement is determined by: (1) the basic dispersal rate, $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}$, or $\varepsilon_{\mathrm{NH} \rightarrow \mathrm{H}}$, (2) the proportion of males among migrants, $\theta$, and (3) the ratio of the kangaroo numbers in both populations. Therefore the individual dispersal rate for males is

$$
\begin{equation*}
\varepsilon_{1}=\theta \varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}} \frac{N_{\mathrm{H}}}{N_{\mathrm{NH}}} \quad \varepsilon_{2}=\theta \varepsilon_{\mathrm{NH} \rightarrow \mathrm{H}} \frac{N_{\mathrm{NH}}}{N_{\mathrm{H}}} \tag{13}
\end{equation*}
$$

and for females it is

$$
\begin{align*}
& \varepsilon_{1}=(1-\theta) \varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}} \frac{N_{\mathrm{H}}}{N_{\mathrm{NH}}} \\
& \varepsilon_{2}=(1-\theta) \varepsilon_{\mathrm{NH} \rightarrow \mathrm{H}} \frac{N_{\mathrm{NH}}}{N_{\mathrm{H}}} \tag{14}
\end{align*}
$$

where $N_{\mathrm{H}}$ and $N_{\mathrm{NH}}$ are the number of kangaroos in the harvested population and refuge population, respectively. The dispersal rate for any particular sex or direction, $\varepsilon$, is converted to the probability that an individual will disperse in a single time step, $p$ (dispersal) using the following equation:

$$
\begin{equation*}
p(\text { dispersal })=1-e^{-\varepsilon} \tag{15}
\end{equation*}
$$

Because $p$ (dispersal) depends on the ratio of the kangaroo numbers in both populations, the smaller population acts as a sink and the larger population as a source until both populations are equal in size. This mechanism is consistent with the concept of an ideal free distribution, in which foragers redistribute themselves so that the resource exploitation rate is the same for all animals (Fretwell and Lucas 1970). The rate $\varepsilon$ is kept small to reduce the likelihood of time-delayed fluctuations in population size.

In real kangaroo populations, movement between harvested and refuge areas is likely to be influenced by differences in habitat quality. Harvesting often concentrates in open, more easily accessible areas, which seem to be more favorable for red kangaroos compared to refuge areas. In the model, we can account for a dispersal preference by using different values for $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}$ and $\varepsilon_{\mathrm{NH} \rightarrow \mathrm{H}}$ in Eqs. 13 and 14.

## Genetics

In life history theory, it is usually assumed that growth is a trade-off with survival, such that the cost of being large is a reduced survival probability (Roff 1992, Stearns 1992). In the absence of such trade-offs, there would be a tendency for fixation at the highest possible trait values. Kangaroo surveys over many years suggest that, in drought years, large individuals are more likely to die than smaller ones. Furthermore, reproductive success is positively correlated with size: size influences mating success in males, whereas size effects initiation of maturity in females. Hence, it appears that there is a trade-off between size and drought resistance in kangaroos, but as far as we know, details on the underlying genetics of this trade-off are unknown. Our goal was to examine the ability of dispersal from nonharvested populations to buffer this trade-off against selection pressure imposed by size-selective harvesting. We employed simulation-based quantitative genetic modeling to generate a range of possible evolutionary responses to harvesting.

We assume that drought resistance and size are additive, quantitative traits. The genome is diploid, with characters being modeled by 20 diallelic autosomal loci with free recombination among them. All of the loci are pleiotropic; at every locus, the allele increasing growth also decreases drought resistance, so that there is always a complete trade-off between the characters (genetic correlation of negative one). Each parent contributes $50 \%$ to the genes of their offspring, chosen at random from the alleles at each locus. Thus, if an individual homozygous for drought resistance (i.e., all drought resistance alleles) mates with an individual homozygous for size alleles, the resulting offspring will have half dought resistance alleles and half size alleles.

There is no dominance between alleles; trait expression depends entirely on the number of alleles for
each trait that an individual possesses. Thus, the degree of drought resistance depends on the total number of drought resistance alleles in the whole genome, whereas the growth rate depends on the total number of "size" alleles. Higher or lower numbers of alleles are mapped to trait values using an inverse normal distribution. Genotypes of the population at the beginning of the simulation were sampled independently among loci such that the expected allele frequency at each locus was 0.5 . Model runs based on 100 loci for each trait resulted in the same equilibrium allele frequency as runs using 20 loci, but it took longer to reach the equilibrium. Therefore, we have limited our analyses to 20 loci for the sake of simplicity.

Size genes.-In our model there are two benefits of increased growth rate. First, male size is correlated with mating success (Walker 1995). If two or more males compete for access to a female, the largest one usually wins. This does not mean that small individuals are excluded from mating, but their probability of mating successfully is reduced compared to that of larger counterparts. Second, age at maturity depends on size. Larger females tend to reach maturity earlier than smaller individuals. In the model the genetic make up of an individual determines size at birth and the age at which individuals reach the sex-specific asymptotic size.
Size genes could influence growth in different ways. In this model we consider two different mechanisms. First, we assume that the entire growth curve is shifted up or down depending on the frequency of size genes. This means that an individual with a small number of size genes starts out small and never catches up in size relative to an individual with many size genes. Second, we assume that the number of size genes determines the growth rate, $c$, in Eq. 10. Following this latter assumption, individuals approach the same asymptotic head size at different rates. The number of size genes is mapped to asymptotic size, $y_{\infty}$, or growth rate, $c$, associated with a particular number of size genes using an inverse Gaussian function with mean $\bar{y}_{\infty}$, or $\bar{c}$, and standard deviation, $\sigma_{\text {growht }}$. The exact value for an individual depends on the number of size alleles $(S)$ that they have relative to the maximum possible ( $S_{\max }$ ),

$$
\begin{equation*}
y_{\infty}=\bar{y}_{\infty}+\sigma_{\text {growth }} \Phi^{-1}\left(S / S_{\max }\right) \tag{16}
\end{equation*}
$$

where $\Phi^{-1}$ is the inverse normal distribution function. Using the baseline parameters, the effect of the different number of size genes causes the asymptotic male head size to vary between 168 mm (no size alleles) and 201 mm ( $100 \%$ size alleles) in the first growth model. Under the second growth model, male kangaroos reach 170 mm head size between 3 and 12 years of age ( $100 \%$ and $0 \%$ size alleles, respectively).

Drought resistance genes.-Annual rainfall greatly influences water availability and plant growth and, consequently, kangaroo mortality (Bayliss 1985). Therefore, in this paper we use drought resistance as being analogous to stress tolerance caused by poor nutrition

Table 2. Starting conditions of all simulations.

| Parameter | Term | Value | PDF $\dagger$ |
| :--- | :--- | :---: | :--- |
| Number of males | $n_{\text {males }}$ | 50 | constant |
| Number of females | $n_{\text {females }}$ | 50 | constant |
| Proportion of size alleles | $\gamma$ | 0.5 | Beta $(5,5)$ |

$\dagger$ Probability distribution function for the sensitivity analysis.
and dehydration. The number of "drought resistance" alleles results in a particular survival rate in exactly the same manner as for growth effects (see Eq. 16), but with mean $\bar{\mu}_{R, x, z}$ (see Eq. 7), and standard deviation $\sigma_{\text {drought }}$. We model the increasing influence of drought resistance allele with decreasing rainfall by increasing $\sigma_{\text {drought }}$ as rainfall decreases. Therefore, in a run of "good" years there is no advantage to having drought resistance alleles, because the survival of all individuals of the same sex and age is virtually the same. See Appendix C for a more detailed description of how $\sigma_{\text {drought }}$ influences survival.

## Sensitivity analysis

Our model is very complex and there is considerable uncertainty in estimates of the input parameters. We want to know how changes in the input parameters would alter the model predictions. Sometimes the effect of changing one parameter value depends on the values of other parameters. The technique that we used is called Latin Hypercube Sampling (LHS) and is described in Appendix D. It has been used in the analysis of complex ecological models elsewhere (Rushton et al. $2000 a, b$ ). We consider four scenarios within which the parameters are varied: (1) size alleles determine asymptotic growth, no dispersal from nonharvested population; (2) size alleles determine growth rate, no dispersal from nonharvested population; (3) size alleles determine asymptotic growth, dispersal from nonharvested population; or (4) size alleles determine growth rate, dispersal from nonharvested population.

We also varied the initial proportion of size genes in the population (Table 2). We keep track of genetic changes by examining the number of size alleles as a proportion of its maximum ( $S$ ). For example, $S=0.6$ means that kangaroos have, on average, $60 \%$ size alleles and $40 \%$ drought resistance alleles. To allow the allele frequency to stabilize in the absence of harvesting, the populations were not harvested in the first 100 years. We calculated $S$ in the year before harvesting commences $\left(S_{1}\right)$ and after 100 years of harvesting $\left(S_{2}\right)$, and used the difference in $S\left(\Delta S=S_{2}-S_{1}\right)$ as an indicator for the magnitude of genetic change. A negative value of $\Delta S$ indicates that kangaroos grow more slowly or have a lower asymptotic size. We also present results for the effect of harvesting on abundance in the harvested population, calculated as the difference between the population size at the onset of harvesting $\left(n_{1}\right)$ and abundance after 100 years of harvesting $\left(n_{2}\right)$, $\Delta n=n_{2}-n_{1}$.

The relationship between variation in the input parameters and the magnitude of genetic change is quantified with Partial Rank Correlation Coefficients (PRCC; Blower and Dowlatibadi 1994). Although we calculated PRCCs for all combinations of inputs and outputs, for the sake of brevity we present only the values for the combinations that we are most interested in: the effect of management controls and dispersal rates. We plot the relationship between inputs and $\Delta S$ or $\Delta n$ only for combinations with correlations significant at $P<0.01$. Note that the graphs do show the median genetic or abundance change for all parameter combinations; we simply are not presenting them as functions of inputs with weak relationships or that are beyond the control of managers.

## Heritability estimates

The magnitude of a genetic response to selection depends on the amount of additive genetic variation that contributes to the overall phenotypic variation observed and the heritability of that additive genetic variation. Therefore we calculated the heritability of the rate of growth to maturity (calculated as size at maturity/age at maturity), using all females maturing between year 50 and year 100 in a single baseline run, a total of 3926 individuals. We calculated an offspringmidparent regression (Hartl and Clark 1989), which is the phenotypic covariance between the average growth rate to maturity of the two parents and the growth rate to maturity of their offspring, divided by the phenotypic variance of growth rate to maturity. We then calculated a bootstrap standard error for this estimate using 1000 bootstrap replicates.

## Results

The population dynamics of the simulated kangaroo populations are strongly influenced by annual rainfall. In years of high rainfall, the population size increases; in drought years, the numbers sharply decrease (Fig. 1). This pattern is consistent with that observed in natural populations (Caughley et al. 1984, Bayliss 1985, 1987, Cairns and Grigg 1993). Harvesting reduces simulated kangaroo abundance, and kangaroo numbers fluctuate around a lower mean value.

Despite the large fluctuation in population numbers, the average allele frequency across loci is quite stable prior to the onset of harvesting (Fig. 2). However, with no dispersal between populations and the highest minimum size for harvesting $\left(y_{\text {min }}\right)$, the proportion of size alleles decreases markedly in the harvested population


Fig. 1. Simulated population dynamics of red kangaroos (solid line) and the corresponding rainfall (gray bars). Harvesting commences after 100 years, size alleles determine asymptotic growth, and there is no dispersal from the nonharvested population.
after harvesting commences, whereas the proportion of size alleles in the refuge population remains unchanged (Fig. 2). A reduction in the proportion of size alleles $(\Delta S<0)$ means that size-selective harvesting reduces the average age-specific size of kangaroos. This result is consistent with data on heavily harvested populations of several different aquatic species (see review in Ratner and Lande 2001). As a result of the particular tradeoff chosen in our model, size-selective harvesting also increases the degree of drought resistance (or stress tolerance). In the scenarios with dispersal between the refuge population and the harvested population, the median proportion of size alleles remains at about the pre-harvesting level in both populations ( $\Delta S \approx 0$ ). In the majority of runs, the change in allele frequency due to harvesting does not disappear after the cessation of harvesting.

We used the sensitivity analysis to evaluate (1) how sensitive the model predictions are to the uncertainty in the parameter estimates, and (2) the ability of management controls to counteract the effect of size-selective harvesting. Kangaroo managers can manipulate the harvesting rate, $q$, the size distribution of harvested animals (i.e., $y_{\text {min }}$ ), and they can set aside harvest refuges. In scenarios with no dispersal from harvest refuges, 100 years of size-selective harvesting resulted in a reduced proportion of size genes (median $\Delta S<0$ ) in $85 \%$ of the runs, with $37 \%$ decreasing by -0.1 or more (Fig. 3A, B). The largest change was -0.35 . The partial rank correlation coefficients (PRCCs; Table 3) indicate that the proportion of size alleles decreases with increasing harvesting rate $(q)$ and increasing minimum size $\left(y_{\text {min }}\right)$ for both growth models (PRCCs $<0$ ). Increasing the harvesting rate has a relatively larger effect than increasing the minimum size (see also Fig. 3A, B).

In contrast, in the scenarios with dispersal from harvest refuges, only $54 \%$ of runs had a reduced proportion of size alleles, with only $2 \%$ of runs with a reduction
greater than -0.1 (Fig. 3). The largest reduction was -0.19 . The dispersal rate from the harvesting population into the refuge population, $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}$, has a small negative effect on the reduction of size genes (Table 3; Fig. 3C) when size alleles influence the asymptotic size. The minimum harvested size $\left(y_{\text {min }}\right)$ also has a significant negative effect on the median change in both growth models (Table 3), but the magnitude is considerably smaller than that observed when there is no dispersal (Fig. 3D).
The effect of harvesting on the change in abundance is very consistent between growth models and the presence of harvest refuges. Increasing the harvest quota results in a greater decrease in abundance in all scenarios (Fig. 4A,C, Table 3). Increasing the minimum harvested size ( $y_{\text {min }}$ ) reduces the change in abundance in all scenarios (Fig. 4B,D, Table 3). The effect of harvesting on abundance is not greatly affected by the presence of harvest refuges; the median change in abundance is -102 without harvest refuges and -89 with refuges.

The heritability of growth rate to maturity for females in the model is 0.14 (bootstrap SE 0.008 ).

## Discussion

It is believed that refuges help to preserve genetic diversity and to maintain population size and age structure, which are thought to permit evolutionarily adaptive responses in the face of environmental uncertainty (Carr and Reed 1993, Quinn et al. 1993). This paper assesses the value of refuges to prevent evolutionary change due to size-selective harvesting. Our model suggests that it is likely that size-selective harvesting reduces the proportion of size alleles when the entire population is subject to harvesting. Moderate dispersal from nonharvested areas has the potential to counteract this directional change toward smaller kangaroo sizes. These results are not an artifact of random genetic drift


Fig. 2. Average number of size alleles as a proportion of the maximum number for the harvested (solid line) and the nonharvested population (dotted line) when harvesting is maximally size selective. Harvesting commences after 100 simulated years, with minimum size $y_{\text {min }}=35 \mathrm{~kg}$, size alleles determine asymptotic growth, and there is no dispersal between populations.


Fig. 3. Influence of size-selective harvesting on the frequency distribution of size alleles of the scenarios with no dispersal (A, B) and with dispersal from harvest refuges (C, D). Each symbol is the median of the 20 replicate runs at a single parameter set; all 150 parameter sets are shown in each panel. Open circles (solid lines) indicate the runs where the size alleles determine the growth rate, $c$, and the open triangles (dashed lines) indicate those runs where the size alleles determine the asymptotic size, $y_{\infty}$. The lines are created using a smooth spline function. Variation around the line is due to variation in the parameters other than the one displayed. $\Delta S$ specifies the change in the proportion of size alleles after 100 years of harvesting; there is no change if $\Delta S=0$. Parameter values for harvesting rate $(q)$, the minimum size $\left(y_{\min }\right)$, and the dispersal rate from the harvested population into the nonharvested population ( $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}$ ) are expressed as standard deviations above or below the mean ( 0 indicates the mean parameter value).

Table 3. Partial rank correlation coefficients (PRCC).

| Parameter | Size <br> alleles $\rightarrow$ | No dispersal |  | With dispersal |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | $\Delta S$ | $\Delta n$ | $\Delta S$ | $\Delta n$ |
| $q$ | $c$ | -0.58 | -0.23 | -0.16 | -0.36 |
|  | $y_{\infty}$ | -0.49 | -0.25 | -0.02 | -0.42 |
| $y_{\text {min }}$ | c | -0.32 | 0.36 | -0.32 | 0.26 |
|  | $\boldsymbol{y}_{\infty}$ | -0.32 | 0.36 | -0.29 | 0.24 |
| $\varepsilon_{\mathrm{H} \rightarrow \mathrm{NH}}$ | c |  |  | -0.14 | -0.02 |
|  | $\boldsymbol{y}_{\infty}$ |  |  | -0.33 | 0.05 |
| $\varepsilon_{\text {NH } \rightarrow \mathrm{H}}$ | $c$ |  |  | 0.01 | 0.05 |
|  | $\boldsymbol{y}_{\infty}$ |  |  | -0.10 | -0.06 |

Note: Boldface indicates results significant at the 0.01 level and shown in Figs. 3 and 4.
in small populations. First, our model includes balancing selection, which has a stabilizing effect on allele frequency. Second, $\Delta S$ did not change if we ran the model without harvesting and adjusting the degree of density dependence in juveniles such that the average population size $\approx 100$ (results not shown). Third, random genetic drift would equally likely result in fixation of size or drought resistance alleles, resulting a large scatter around the zero line in Fig. 3A and B. In contrast, in our simulations $\Delta S$ significantly decreases with increasing harvesting rate and increasing degree of size selectivity. Finally, the sensitivity analysis is based on the median of 20 replicate runs at each parameter combination. Genetic drift would lead to random variation around the median response, but it should be equally


Fig. 4. Effect of size-selective harvesting on the median change in abundance ( $\Delta n$ ) between the onset of harvesting and 100 years later. All symbols and lines are as in Fig. 3.
likely to be in either direction, and therefore the median should be a good representation of how the model is responding to changes in parameters despite random drift in genetics and demographic stochasticity in abundance.

Hale (2001) examined the genetic diversity of red kangaroos and wallaroos (Macropus robustus) by analyzing allozymes and microsatellite loci. He did not find any significant differences in levels of allelic diversity between nonharvested and harvested areas. In his analysis he included samples from areas with harvesting rates close to $30 \%$. These results might lead to the conclusion that size-selective harvesting is not affecting allele frequencies in kangaroos. Our model highlights two alternative explanations for Hale's (2001) findings:

1) Currently the size of the nonharvested area and the dispersal rate between harvested and nonharvested populations are sufficiently large to counteract the effect of size-selective harvesting. This situation may change. There is a movement to promote kangaroo products (Grigg 1988, 1997, Grigg et al. 1995, Switala

1995, Grigg and Pople 2001), which might result in a decreasing refuge area. A large percentage of the kangaroo population is not harvested because they live in areas where harvesting it is not economical because of poor accessibility (remoteness, difficult terrain, thick vegetation, or poor road network). Ron Hacker (unpublished manuscript) estimates that currently in New South Wales $\geq 5 \%$ of the kangaroo population lives in such "economical harvest refuges," in addition to 3\% that live in national parks.
2) Our model suggests that the allele frequency changes gradually. Consequently, effects on wild populations will be detectable only over a long time. It could be that the populations have not been exposed to sufficient harvesting pressure long enough to generate any measurable change in the gene frequency. Few estimates are available prior to 1980, so the historical harvest rate that was imposed is unclear. Since 1980, the harvest rate has generally increased nationally in Australia (Grigg and Pople 2001). However, substantial harvest rates of kangaroos comparable to
recent years have only been reported for some states (Pople and Grigg 1998).

Our model is tailored to the biology of kangaroo populations, but we believe that the value of harvest refuges demonstrated in our model would hold for a wide range of species that have to cope with a highly stochastic food supply and that experience size-selective harvesting. The advantage of constructing a spe-cies-specific model is that we know a great deal about the population processes in the model and our parameter estimates are based on empirical studies. This is particularly important because of the large uncertainty involved in modeling the genetics. The underlying genetics determining body size and the interactions with other traits are largely unknown. We now discuss the different aspects of this uncertainty.
Heritability of body size.-Heritability is the proportion of phenotypic variation due to the additive effect of genes. There is an additive genetic component to size variation (Gjedrem 1983, 1986). Roff (2000) reviewed the heritability of size at maturity for a variety of species and reported values as low as 0.09 to as high as 0.90 . The heritability of body size in natural fish populations is likely to be in the range of $0.2-0.3$ (Stokes and Law 2000). Most studies on heritability of body size are concerned with size at maturity. In our model, size at maturity is determined by Eq. 3. What changes is how quickly individuals reach a particular size. The overall heritability of growth rate to maturity ( 0.14 ) created by our genetic model is comparable, albeit at the low end of the range, with that observed in natural populations. If the heritability is excessively large, the model is overestimating the response to selective harvesting, whereas if it is too small, the model is underestimating the response. Unfortunately no information exists on the heritability of size for kangaroos.

Growth model.-A common assumption in life history models is that all individuals follow more or less the same growth trajectory (Roff 1992, 2000, Klingenberg and Spence 1997). In this case, differences in adult size are caused by different birth sizes or variation in developmental time. Alternatively, evolution could act on selecting for different intrinsic growth rates (Arendt 1997). For most species, including kangaroos, we do not know which is more important. In our model we mimic both life history tactics by assuming that the number of size genes determines either the asymptotic size or the growth rate. The sensitivity analysis of our model suggests that the way in which genes control growth does not strongly influence the selection for smaller body size due to size-selective harvesting.

Genetic trade-off.-Life history theory is based on the hypothesis that evolution is constrained by the presence of trade-offs among some of the traits that contribute to fitness (Roff 1992, Stearns 1992). One commonly assumed trade-off is that between size and survival, with the fitness trade-off arising from a corre-
lation between fecundity and body size. In kangaroos, larger body size decreases age at maturity (Dawson 1995) and increases male mating success because larger males are more successful in competing for females (Moss 1995, Walker 1995).

In our model we assume that size is traded off with survival under drought conditions. We consider annual rainfall as an indicator of food and water availability, which in our model influences growth, reproduction (via juvenile survival), and adult survival. We used drought resistance as a trade-off, rather than the agedependent survival probability, for two reasons.

First, Tenhumberg et al. (2000) found that optimal life history strategies depend on whether individuals have a constant or stochastically varying food supply. Thus, kangaroos and other animals living in arid environments with a highly stochastic food supply are likely to have evolved appropriate life history strategies. By using drought resistance as a trade-off, we examined the effect of this stochastic selection pressure on the genetic response to size-selective harvesting. One alternative would be to allow the age-dependent survival probability to respond to genetic variation. This would disadvantage "large" individuals every year independent of the environmental conditions, resulting in a much stronger selection pressure for being small, and a more rapid evolutionary response to selective harvesting. Using an alternative trade-off would not alter our qualitative conclusions, because the aim of our model is not to make quantitative predictions about genetic change, but to evaluate the potential of harvest refuges as a management strategy to minimize the risk and amount of change in the allele frequency.

Second, Arendt (1997) and Reznick et al. (2000) review empirical evidence that, in a great many species, the cost of rapid growth is a reduced ability to respond to environmental stress, such as nutrient stress. Examples of stress-tolerant, relatively slow-growing species include lizards, frogs, snails, insects, and birds. Slow growth allows organisms that experience nutrient stress to use what nutrients are available most efficiently and to survive longer. In kangaroos, drought reduces the availability of water and food, resulting in increased mortality. Starving kangaroos are also particularly susceptible to hypothermia. Stress-resistant kangaroos might use nutrients to build a heavy fur or to develop greater fat reserves in favor of rapid growth. A range of possible physiological and behavioral differences is possible.

## Conclusions

This study suggests that size-selective harvesting can result in smaller kangaroos of a given age with higher survival probability under drought conditions. The effect of size-selective harvesting increases with increasing harvesting rate and minimum size of the harvested animals. In scenarios with moderate dispersal from a
nonharvested population, virtually all effects of harvesting on genetic structure disappear.

This paper highlights a potential conflict in sustainable use of wild life populations. Restricting harvesting to individuals with a high minimum size is commonly done to ensure the viability of a population. As a side effect, the balance of natural section changes to favor individuals with slower growth. Genetic change does not necessarily reduce the viability of a population. In the eyes of some kangaroo harvesters or conservation biologists, it would be beneficial to change the balance in favor of kangaroos with higher drought resistance because this would decrease the variance in the population dynamics of kangaroos. However, in a multitrait system, both positive and negative correlations can occur despite underlying physiological trade-off between pairs of traits (Charlesworth 1980, Charnov 1989). For example, Stokes and Law (2000) argue that genetic changes caused by size-selective harvesting in fish are large enough to affect the productivity of fisheries.

Because it is likely that there will be complex interactions between traits not considered in this paper, a precautionary management approach would be to minimize any genetic change, especially if we do not know that cessation of harvesting will reverse selection back to the original state (Stokes and Law 2000). Our model suggests that setting aside harvest refuges as a management strategy has a great potential to resolve this conflict. In order to determine the appropriate size and distribution of harvest refuges in the landscape, we need a better understanding of dispersal in the species in question, and the strength of selection under different harvesting regimes (i.e., different combinations of dispersal rates and degrees of size selectivity).

## Acknowledgments

We thank the Murray Darling Basing commission for funding this project. The manuscript was greatly improved thanks to comments from Steve McLeod, Ron Hacker, and members of the Ecology Center, University of Queensland, especially Hamish McCallum and Peter Hale. Discussions with Rob Toonen, University of Hawaii, cleaned up the description of the genetic architecture of the model. We also thank two anonymous reviewers for their useful comments. This is a contribution of the University of Nebraska Agricultural Research Division, Lincoln, Nebraska 68583, Journal Series Number 14372.

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## APPENDIX A

Equations, regression tables, and graphs of parameter estimation for kangaroo maturity, mortality, and growth are available in ESA's Electronic Data Archive: Ecological Archives E085-056-A1.

## APPENDIX B

A graph of kangaroo survival probabilities is available in ESA's Electronic Data Archive: Ecological Archives E085-056A2.

## APPENDIX C

A model and graph of the genetics of drought resistance are available in ESA's Electronic Data Archive: Ecological Archives E085-056-A3.

## APPENDIX D

A discussion of sensitivity analysis is available in ESA's Electronic Data Archive: Ecological Archives E085-056-A4.


[^0]:    Manuscript received 24 November 2003; accepted 25 November 2003; final version received 19 December 2003. Corresponding Editor: W. S. C. Gurney.
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