# Logistic Surplus-Production Model with Explicit Terms for Growth, Mortality, and Recruitment

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#### Abstract

Conventional interpretations of the logistic equation and the logistic surplus-production model appear to indicate that regulation of population size occurs as a result of competition for resources among the recruited members of a population. Compensation for fishing mortality may involve increased growth of adults and an increase in fecundity, but the major compensatory factor is increased survival of early life stages. In this study, the logistic surplus-production model is formulated in explicit terms for growth, reproduction, and mortality, and in this new formulation the capacity of a population to increase and sustain a fishery is based on a stock-recruitment relation that is a more realistic interpretation of fishery dynamics. All parameters can be estimated with catch and effort data. The models were applied to the American lobster *Homarus americanus* fishery in Maine and the spiny dogfish *Squalus acanthias* fishery. There is a considerable difference in the stock-production curves between the two fisheries that can be interpreted in terms of a similar difference in the spawner-recruit curves. Because spiny dogfish produce relatively few young, they have a lower potential for increase than American lobsters and their rate of recruitment does not increase with exploitation as greatly as that for lobsters.

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Surplus-production models provide a simple means for description of the dynamics of exploited populations in terms of a density-dependent compensatory response to fishing, they are relatively easy to study analytically, and they often can be applied for stock assessment with only catch and effort data. These are good reasons for application of surplus-production models. However, with surplus-production models, the dynamics of a population are described in terms of vague notions of a carrying capacity and a coefficient for increase. The capacity of a population to increase is some function of population size; a maximum capacity for increase occurs at an intermediate population size, which appears to indicate that compensation for exploitation occurs during the recruited life stages. Exploitation may result in a decrease in natural mortality of recruits, an increase in growth of recruits, and an increase in fecundity, but increased survival of early life stages is the major compensatory mechanism (Beverton and Holt 1957; Ricker 1975).

The logistic model can be interpreted in several different ways and some interpretations are consistent with the observed dynamics of fisheries. Walter (1978) developed a surplus-production model that incorporates a recruitment function and that gives a more realistic description of the compensatory dynamics of a fish population in terms of a spawner-recruit curve, but to apply his model, data for recruitment as well as for catch and effort are necessary. Recruitment data are available for few fisheries and when they are, age-structure data also are likely to be available and a surplus-production model usually would not be applied. Deriso (1980) developed a yield equation that gives change in biomass in terms of growth, recruitment, and mortality; his model has some features in common with surplus-production models but it is a discrete-time model.

It is shown in this study that the logistic surplus-production model can be interpreted in terms of explicit components for growth, mortality, and recruitment and that all of the parameters can be estimated from catch and effort data. The model is applied to describe the dynamics of fisheries for American lobster *Homarus americanus* and spiny dogfish *Squalus acanthias.* The life histories of these two species are different and a comparison of the models fitted to these two species provides an evaluation of the ability of the models to distinguish differences in spawner-recruit relations.

# **Model Development**

For surplus-production models, the capacity of a population to increase is some function of population size and the maximum capacity to increase occurs at some intermediate population size. A commonly applied surplus-production model is the logistic model developed by Volterra (1928), Graham (1935), and Schaefer (1954, 1957), described by the equations

$$dY/dt = qEB$$
 and (1)

$$dB/dt = kB - kB^2/B_{\infty} - qEB; \qquad (2)$$

- Y = cumulative yield;
- t = time;
- B = biomass of the exploited part of the population;
- $B_{\infty}$  = environmental carrying capacity in terms of biomass;
  - k = population growth coefficient;
  - q = catchability coefficient;
  - E = fishing effort.

Under equilibrium conditions where dB/dt = 0, the relation between annual equilibrium yield  $Y_e$  and biomass is the parabola

$$Y_e = kB - kB^2/B_{\infty}, \tag{3}$$

and the relation between annual equilibrium yield and effort is the parabola

$$Y_{\ell} = qB_{\infty}E - (q^2B_{\infty}/k)E^2.$$
(4)

The logistic surplus-production model indicates that a maximum sustainable yield MSY of  $kB_{\infty}/4$ occurs at a biomass of  $B_{\infty}/2$  and a fishing effort of k/2q. Useful modifications of the logistic surplus-production model have been suggested by Pella and Tomlinson (1969), Fox (1970), Walter (1973, 1978), and Marchesseault et al. (1976).

Russell (1931) described the change in abundance of an exploited fish stock in terms of a balance among natural mortality, recruitment, growth, and fishing mortality using the equation

$$B(t) = B(t - 1) + R + G - F - M; \quad (5)$$

- B(t) = biomass of the catchable stock at time t;
- B(t-1) = biomass of the catchable stock at time (t-1);

- R = increase in biomass of the catchable stock through recruitment;
- G = increase in biomass of the catchable stock through growth of individuals from time t to t + 1;
- F =loss of biomass from the population through fishing;
- M =loss of biomass from the population through natural mortality.

In Equation (5), the change in stock biomass equals recruitment plus growth minus natural and fishing mortality. If change in growth, natural mortality, and fishing mortality are assumed proportional to stock size, Russell's model can be written as

$$dY/dt = qEB$$
 and (6)

$$dB/dt = (K - M)B + R(t) - qEB, \quad (7)$$

where the new terms are

- K = parameter for increase in biomass resulting from growth in size of individuals;
- M = natural mortality coefficient;
- R(t) = biomass of recruitment at time t.

Equations (6) and (7) form a general surplusproduction model that includes many other models as special cases. First the case with constant recruitment will be considered. With constant recruitment, Equation (7) predicts that biomass of an unfished population will converge to  $R_c(M - K)^{-1}$  and this is the carrying capacity;  $R_c$  is a constant rate of recruitment. At any level of fishing such that (M + qE) > K, population biomass will converge to  $R_c/(M - K + qE)$ . Under equilibrium conditions, the relation between annual equilibrium yield and biomass is the linear equation

$$Y_e = R_e + (K - M)B.$$
(8)

This is the equation for equilibrium yield given by Russell (1931). The stock-production curve is a line that decreases from  $R_c$  at B = 0 to zero at  $B = R_c/(M - K)$  provided that M < K.

If recruitment is constant, the relation between annual equilibrium yield and fishing effort is the asymptotic equation

$$Y_{e} = qER_{c}/(M - K + qE).$$
(9)

The asymptote is recruitment  $R_c$ . The model predicts no maximum yield; yield increases toward an asymptote as effort increases and the

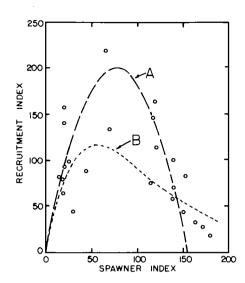


FIGURE 1.—Spawner-recruit data for Atlantic cod 1938-1960 and (A) parabolic and (B) Ricker spawner-recruit functions.

highest yields from the fishery occur when the level of fishing is intense and the population consists of newly recruited individuals. This is the same relation obtained with the dynamicpool model when natural mortality is high and recruitment is constant (Beverton and Holt 1957).

Recruitment often is assumed to be a function of population size, increasing to a maximum at an intermediate level of stock biomass and then decreasing with further increase in biomass. Ricker's (1954) spawner-recruit relation between recruitment at time t and biomass at time  $(t - t_m)$ , where  $t_m$  is the age at maturity, is

$$R = aB(t - t_m)e^{-hB(t - t_m)},$$
 (10)

where a and h are parameters. This is a flexible function that describes the pattern but a parabola gives a similar pattern and leads to the logistic surplus-production model. A surplus-production model could be formulated based on Ricker's model but Ricker's model is difficult to handle mathematically. The parabola can be considered an approximation to Ricker's function; the series expansion of the exponential term of Ricker's model is

$$e^{-hB} = \sum_{i=0}^{\infty} (-hB)^i / i!$$
 (11)

and for an approximation with i = 1, Ricker's

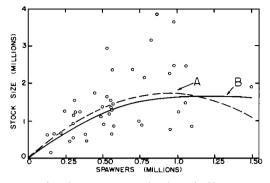


FIGURE 2.—Spawner-recruit abundance for Skeena River sockeye salmon 1908–1952 and (A) parabolic and (B) Ricker spawner-recruit functions.

recruitment equation becomes the parabola

$$R = aB(t - t_m) - bB(t - t_m)^2, \qquad (12)$$

where b is a parameter. For some species for which the number of spawners and recruits or spawner and recruit indices are available, a parabola fits about as well as Ricker's model. To demonstrate this, a parabola and Ricker's model both were fitted by least squares to the spawner-recruit data for Skeena River sockeye salmon Oncorhynchus nerka published by Shepard and Withler (1958) and to the data for Atlantic cod Gadus morhua published by Garrod (1967). For both of these populations, there is considerable scatter, as is typical of spawner-recruit data, and the parabola fits about as well as Ricker's model (Figs. 1 and 2).

If recruitment is described by a parabola, the surplus-production model (Equations 6 and 7) becomes

$$dY/dt = qEB \tag{13}$$

$$\frac{dB}{dt} = (K - M)B^2 + aB(t - t_m) - bB(t - t_m)^2 - qEB, \qquad (14)$$

which is a logistic surplus-production model with a time lag and it is similar to the model suggested by Marchesseault et al. (1976). Estimation of parameters for surplus-production models is difficult and the above model cannot be easily fitted with only catch and effort data, so recruitment is assumed to be instantaneous; then the model becomes

$$dy/dt = qEB \tag{15}$$

$$dB/dt = (K - M + a)B - bB^2 - qEB,$$
 (16)

which is a logistic surplus-production model. However, the parameters now have a different interpretation; in Equation (16) the density dependence operates through the spawner-recruit relation and the rate of recruitment is a maximum at some intermediate population size.

Although the model with a time lag describes the recruitment process more accurately and may be better for forecasting, surplus-production models usually are applied for equilibrium analyses and, in this situation, the above two models become nearly identical. Some time-lag models result in different behavior from the logistic model (Marchesseault et al. 1976), whereas other models result in behavior similar to the logistic provided that the time lag is not too long (Hutchinson 1948; Walter 1973). Further study is necessary to determine which timelag models better describe the dynamics of fish populations.

The equilibrium population size for a population described by Equation (16) can be determined from the spawner-recruit relation or from the equation for change in biomass. There is a replacement level of biomass  $B^*$  for an unexploited fishery such that at  $B^*$  the population is at equilibrium and  $R^* = cB^*$ , where c is a parameter and  $R^*$  is recruitment at equilibrium. The level of recruitment at equilibrium without exploitation can be calculated from the spawner-recruit curve as

$$R^* = cB^* = aB^* - b(B^*)^2,$$

which gives the equilibrium biomass in terms of the parameters as

$$B^* = (a - c)/b.$$
(17)

If a population is not exploited, it will maintain itself at  $B^*$  and from the biomass equation (Equation 16), when dB/dt = 0 and  $B = B^*$ , the equation

$$B^* = (a - M + K)/b$$
 (18)

is obtained. Comparison of Equations (17) and (18) shows that the parameter c equals M - K. Recruitment in an unexploited population is

$$R^* = [a(M - K) - (M - K)^2]/b \qquad (19)$$

and a maximum recruitment of  $a^2/4b$  occurs at a biomass of a/2b.

If the dynamics of a fishery are described by Equations (15) and (16) the relations between

yield and biomass and between yield and effort, as well as between recruitment and biomass, are all parabolas. At equilibrium where dB/dt = 0, the relation between annual equilibrium yield and biomass is

$$Y_e = (a - M + K)B - bB^2$$
 (20)

and the maximum yield,  $(a - M + K)^2/4b$ , occurs at a biomass of  $B_{msy} = (a - M + K)/2b$ . The MSY occurs when recruitment is

$$R_{msy} = [a^2 - (K - M)^2]/4b.$$
(21)

The relation between annual equilibrium yield and fishing effort is the parabola

$$Y_{e} = (K - M + a)qE/b - q^{2}E^{2}/b.$$
(22)

# **Parameter Estimation**

Estimation of parameters of surplus-production models is difficult, especially if biomass is not proportional to annual catch per unit of effort (Bannerot and Austin 1983). This brings into question estimation methods that linearize the yield equation and then approximate biomass in terms of catch per unit of effort (for example, Schnute 1977). Numerical integration of the yield equation and nonlinear least squares, as suggested by Pella and Tomlinson (1969), avoids the need to assume biomass is proportion to annual catch per unit of effort. To apply the Pella and Tomlinson (1969) method, it is helpful to use a biomass equation that can be integrated in closed form and this makes it impossible to consider time lags.

To estimate parameters of the logistic model with explicit parameters for growth, mortality, and recruitment, both the model with constant recruitment and the model with a parabolic spawner-recruit function are fitted to the catch and effort data. The constant-recruitment model provides an estimate of K, M, and the average recruitment and is a base from which the relation between stock and recruitment can be measured. All of the parameters can be estimated for the logistic model, the asymptotic model, and the model with a spawner-recruit relation. Parameters of both the logistic and asymptotic model were estimated with nonlinear least squares to fit the solutions of the yield equations to observed yields. Application of the trapezoidal rule to the yield equation gives the estimated yields as (Pella and Tomlinson 1969)

$$Y(t) = qE(t) \int_{t}^{t+1} B(y) \, dy$$
  
=  $qE(t)[B(t+1) + B(t)]/2.$  (23)

For the logistic model biomass values were calculated from the solution to the biomass equation (Equation 2)

$$B(t) = \left\{ \frac{k}{B(k - qE)} + \left[ \frac{1}{B(0)} - \frac{k}{B(k - qE)} \right] e^{-(k - qE)t} \right\}^{-1}.$$
 (24)

For the asymptotic model, biomass values were calculated from the solution of the biomass equation (Equation 16)

$$B(t) = \frac{R}{M + qE - K} [1 - e^{(K - M - qE)t}] + B(0)e^{(K - M - qE)t}.$$
(25)

For the logistic model, the values of the parameters k, q, and  $B_{\infty}$  that minimized the residual sum of squares

$$\sum_{t} [Y(t) - Y(t)]^2$$
 (26)

was found, and for the asymptotic model, the values of the parameters q,  $R_c$ , and (K - M) that minimized the residual sum of squares was found.

Application of the above method gives estimates of k,  $B_{\infty}$ , and q for the logistic model and (K - M),  $R_c$  and q for the asymptotic model. From these estimates the parameters of the spawner-recruit model were estimated as

$$b = k/B_{\infty}$$
 and (27)

$$a = k - c = k + (K - M).$$
 (28)

The term (K + M) can be calculated with the equation

$$K + M = bR^*/a(M - K),$$
 (29)

which is obtained from the equation for  $R^*$  at equilibrium (Equation 19), and then from the estimated values of (M - K) and (M + K), the values of M and K can be estimated.

# **Results and Discussion**

To evaluate the surplus-production model formulated in terms of a spawner-recruit relation, the logistic surplus-production model, the asymptotic model, and the model with a spawner-recruit relation were applied to describe the American lobster fishery of Maine and the spiny dogfish fishery of the North Sea (all subsequent references to "lobster" and "dogfish" refer to these species). These fisheries were selected because a long series of catch and effort data are available for each, and the biology and life histories of lobsters and dogfish are considerably different. Dow et al. (1975) described the lobster fishery and gave catch and effort data for 1928 to 1972; Holden (1977) described the dogfish fishery and gave catch and effort data for 1951 to 1970.

Application of parameter estimates (Table 1) for the logistic and asymptotic surplus-production models, obtained by fitting the catch and effort data with nonlinear least squares, together with the relations given by Equations (27), (28), and (29), gives the estimates of the parameters M and K of the asymptotic model and the parameters of the spawner-recruit model. Population quantities then were derived from these parameters together with the equations of the previous section (Table 1).

Statistical evaluation of the parameter estimates of surplus-production models is difficult; a valid analysis would consider the nonlinearity of the models and correctly model the random variables. Statistical theory for such models is limited (Draper and Smith 1980), and, in this study, accuracy of the parameter estimates was judged qualitatively in terms of how well the fitted models described the observed catch and effort data, in terms of the relations among parameters, and in terms of the relations of certain parameters, such as the carrying capacity, to the observed catch and effort data.

Both the logistic and asymptotic models described the trends in the lobster catch data (Fig. 3), but both models overestimated catch during the early years and underestimated catch from 1950 to 1960. For lobster, the coefficients of determination between observed and predicted yields were high: 0.84 for the logistic model and 0.82 for the asymptotic model. The logistic and asymptotic models also describe the pattern of fluctuations in the dogfish fishery (Fig. 4) but the coefficients of determination are lower than for the lobster: 0.22 for the logistic model and 0.20 for the asymptotic model. Some of the differences in the coefficients of determination between the lobster and dogfish fisheries result from the increase in yield of lobsters, which gives a high slope; the coefficient of determi-

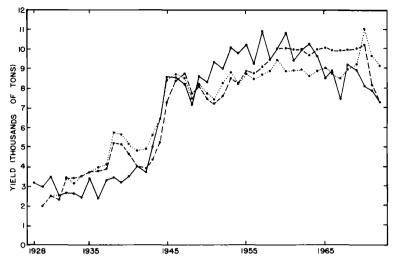


FIGURE 3.—Observed Maine American lobster catch (solid line) and predictions of logistic model (dashed line) and asymptotic model (dotted line).

nation is influenced both by the slope of a relation and by the scatter of observations about the predicted values (Draper and Smith 1980).

For both fisheries, the estimates of the catchability coefficients were the same for the logistic model and the asymptotic model. The carrying capacities of both fisheries are reasonable when compared to yield; for the lobster fishery the MSY is 25% of population size at the MSY and for the dogfish fishery the MSY is 26% of population size. The average recruitment  $R_c$  obtained with the asymptotic model is consistent with the values obtained with the spawner-recruit relation  $R_{msy}$  (Table 1). The recruitment

Parameter or quantity			American	Spiny
Symbol	Term	Unit	lobster	dogfish
	Parameters estimated directly by nonl	inear model fits to	catch_effort data	
k = a - c	Population growth coefficient		0.50	0.50
В	Biomass of exploited population	Tonnes	$8 \times 10^{4}$	$3 \times 10^{5}$
7	Catchability coefficient		$0.3 \times 10^{-6}$	$0.5 \times 10^{-5}$
K = M - K	Equilibrium recruitment parameter		0.03	0.07
R,	Constant recruitment	Tonnes	10,000	42,000
	Parameters estimated f	rom above quantit	ies	
М	Natural mortality coefficient		0.50	0.50
К	Growth coefficient, individuals		0.47	0.43
Ь	Recruitment parameter		$6.25 \times 10^{-6}$	1.67 × 10 <sup>-e</sup>
a	Recruitment parameter		0.53	0.57
	Quantities estimated fr	om above paramet	ers	
B <sub>maxR</sub>	Biomass at maximum recruitment	Tonnes	42,400	170,966
Rmax	Maximum recruitment	Tonnes	11,236	48,725
R*	Equilibrium recruitment	Tonnes	2,400	20,970
B*	Equilibrium biomass	Tonnes	80,000	300,000
B <sub>msy</sub>	Biomass at maximum yield	Tonnes	40,000	150,000
Emsy	Effort at maximum yield	Traps	833,333	
		Hours		500,000
MSY	Maximum sustainable yield	Tonnes	10,000	37,500
R <sub>msy</sub>	Recruitment at maximum yield	Tonnes	11,200	47,990

TABLE 1.—Estimated surplus-production parameters and population quantities calculated from these for the Maine American lobster and North Sea spiny dogfish fisheries.

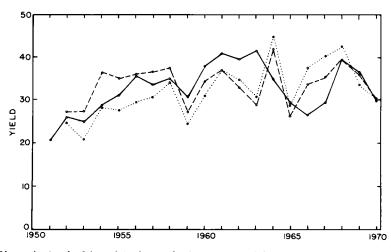


FIGURE 4.—Observed spiny dogfish catch in thousands of metric tons (solid line) and predictions of logistic model (dotted line) and asymptotic model (dashed line).

estimates obtained with the spawner-recruit relation are of considerable interest (Table 1). Recruitment in an unexploited lobster population would be only 3% of the standing stock. At the MSY, lobster recruitment is 26% of the standing stock. Recruitment in an unexploited dogfish population also would be low but at 7% of the standing stock it would be nearly twice as high, relative to stock size, as lobster recruitment. At the MSY, dogfish recruitment is about 28% of the standing stock.

The equilibrium stock-production curves of both the asymptotic model and the logistic model fit the catch and effort data for both the dogfish and the lobster fishery (Figs. 5 and 6), but for the lobster fishery the catch clearly has decreased at high effort and the logistic model describes the pattern better than the asymptotic model. For the dogfish fishery, catch has not decreased with high effort and the asymptotic and logistic models describe the pattern about equally as well. With the logistic model, the MSY for the lobster fishery is 10,000 t at a fishing effort of 833,333 traps, and for the dogfish fishery the MSY is 35,700 t at a fishing effort of 500,000 hours. The effort applied to the lobster fishery has exceeded the level that should produce the MSY and yield has increased to a maximum and begun to decrease as predicted by the model; however, the dome of the equilibrium stock-production curve appears too high and overestimates the MSY. For the dogfish fishery, fishing effort also has gone beyond the

level that should produce the MSY, but there is not a clear peak in the observed catch and effort data. The asymptotic stock-production curve fits the dogfish data about as well as the logistic model, which might indicate that either the capacity of dogfish populations to increase is not closely density-dependent or the population does not have a large reproductive reserve.

Dogfish produce only a relatively small number of young and the spawner-recruit relations for dogfish and lobster are very different (Figs. 7 and 8). For the lobster population, as biomass decreases below the equilibrium-level, recruitment increases sharply and the maximum level

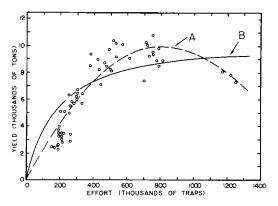


FIGURE 5.—Catch and effort data for Maine American lobster 1928–1972 and equilibrium stock-production curves for (A) logistic model and (B) asymptotic model.

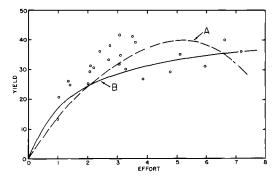


FIGURE 6.—Catch and effort data for spiny dogfish 1951– 1970 and (A) logistic equilibrium stock-production curve and (B) asymptotic stock-production curve. Yield is in thousands of tonnes and effort is hundreds of thousands of hours.

of recruitment is more than five times the level of recruitment without fishing. At the MSY, yield is nearly equal to recruitment. The lobster fishery is sustained largely by new recruits (Dow et al. 1975). The maximum recruitment for dogfish is only a little more than twice the level of recruitment at equilibrium without a fishery.

Many models for biomass change can be developed from the relation among change in biomass, natural mortality, fishing mortality, and growth formulated by Russell (1931). The capacity of the logistic surplus-production model to describe the general pattern of growth of populations has been well established in applications of the surplus-production model to nat-

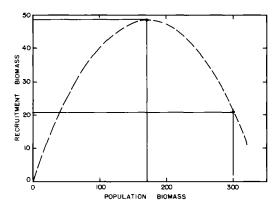


FIGURE 7.—Spiny dogfish spawner-recruit relation estimated from logistic surplus-production model. Recruitment and population biomass are in thousands of tonnes. The points indicate the maximum recruitment and recruitment at equilibrium without fishing.

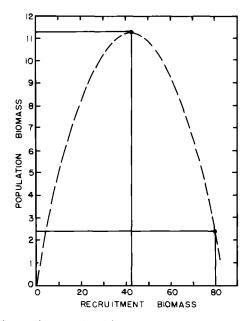


FIGURE 8.—American lobster spawner-recruit relation estimated from logistic surplus-production model. Recruitment and population biomass are in thousands of tonnes. The points indicate the maximum recruitment and recruitment at equilibrium without fishing.

ural populations (for example, Schaefer 1954, 1957; Ricker 1975; Jensen 1976, 1978) and in laboratory experiments (Silliman and Gutsell 1958; Silliman 1968, 1971, 1972; Jensen and Marshall 1982, 1983); therefore, a reasonable approach for development of a model with explicit terms for the components of yield is to formulate the logistic equation in terms of growth, reproduction, and mortality.

Interpretation of the logistic surplus-production model in terms of a recruitment function describes the capacity of a population to increase and support a fishery in terms of an increase in recruitment that occurs with a decrease in population size. In an unexploited stock, a population fluctuates about a carrying capacity that is also the population size for equilibrium between stock and recruitment. Exploitation increases mortality, which decreases stock size; as exploitation increases, stock size decreases and recruitment increases to a maximum and then begins to decrease. The capacity of a population to increase and to support a fishery results from the relation between abundance of spawners and recruitment. This is a more realistic description of the dynamics of an

exploited fish population than is given by the usual interpretation of the logistic surplus-production model. The two descriptions are not incompatible; the usual formulation of the logistic equations assumes that there is densitydependent regulation of population size but it does not describe the mechanism.

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