of Hawai'i Technical Report 4, University of Hawai'i Botany Department, Honolulu, Hawai'i, USA.

National Park Service. 1989. Fire management plan: Hawai'i Volcanoes National Park. United States Department of the Interior, Washington, D.C., USA.

Parsons, J. J. 1972. Spread of African pasture grasses to the American tropics. Journal of Range Management 25:12– 17

Smith, C. W. 1985. Impact of alien plants on Hawaii's native biota. Pages 180-250 in C. P. Stone, and J. M. Scott, editors. Hawaii's terrestrial ecosystems: preservation and management. Cooperative National Park Resources Study Unit, University of Hawai'i, Honolulu, Hawai'i, USA.

Sokal, R. F., and F. J. Rohlf. 1969. Biometry. W. H. Freeman, San Francisco, California, USA.

Vitousek, P. M. 1990. Biological invasions and ecosystem

processes: towards an integration of population biology and ecosystem studies. Oikos 57:7–13.

Vitousek, P. M., and L. R. Walker. 1989. Biological invasion by *Myrica faya* in Hawai'i: plant demography, nitrogen fixation, and ecosystem effects. Ecological Monographs 59: 247–265.

Vogl, R. J. 1975. Fire: a destructive menace or a natural process? Pages 261-289 in J. Cairns, Jr., K. L. Dickson, and E. E. Herricks, editors. Recovery and restoration of damaged ecosystems. University Press of Virginia, Charlottesville, Virginia, USA.

> Manuscript received 20 October 1989; revised 6 April 1990; accepted 17 April 1990; final version received 18 June 1990.

Ecology, 72(2), 1991, pp. 747-750 © 1991 by the Ecological Society of America

## THE SELF-THINNING RULE: DEAD OR UNSUPPORTED?— A REPLY TO LONSDALE

Donald E. Weller<sup>1</sup>

Recent reevaluations have rejected the plant self-thinning rule (Zeide 1985, 1987, Weller 1987a, b, 1990), which had been widely accepted as an ecological law stating that crowded, even-aged stands form a straight line of slope  $-\frac{1}{2}$  in a log-log plot of stand biomass vs. plant density (see review by Westoby 1984). In turn, Lonsdale (1990) found less variability from the ideal  $-\frac{1}{2}$  value and weaker evidence of systematic variation than I did (Weller 1987a, b) and concluded that, while there is no evidence for a thinning rule, the evidence is insufficient for rejection. Here, I will discuss some problems with Lonsdale's reanalysis, clarify some points from my work, and consider whether further testing of the thinning rule is needed.

Lonsdale applied a data-screening procedure that introduced a systematic bias and prejudiced the subsequent results and conclusions. He offered three reasons for disregarding any data set with less than half an order of magnitude of density variation among the stands used to fit the thinning line: inclusion of pre-thinning data biases a thinning slope toward steepness, the steeper thinning slopes in my data base (Weller 1987a) come from data sets with small density ranges (Lonsdale 1990: Fig. 3), and the mean thinning slope becomes steadily shallower as one raises the required amount of density change (Lonsdale 1990: Fig. 4).

<sup>1</sup> Smithsonian Environmental Research Center, P.O. Box 28, Edgewater, Maryland 21037-0028 USA.

Although true, these observations neither justify nor validate the screening procedure. A narrow density range does not necessarily result from including prethinning data, and a large density range in no way ensures the exclusion of inappropriate points (Fig. 1). Also, the thinning equation dictates that stands with steep thinning lines will be observed over narrow density ranges. Therefore, the patterns that motivated Lonsdale's data screening (Lonsdale 1990:Figs. 3 and 4) are actually natural patterns that arise independently of the issue of data selection (Fig. 2). Furthermore, a population with a steeper thinning line must accu-

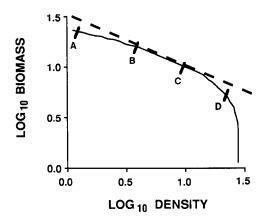


Fig. 1. Some inadequacies of the minimum density-change criterion. Biomass units are grams per square metre; density units are plants per square metre. The actual thinning trajectory (solid line) asymptotically approaches the thinning line (dashed line). Lines fit to data along AB, AC, AD, or BD include pre- or post-thinning data and do not represent the asymptote, yet these lines would pass Lonsadole's filter for inclusion in the analysis. A line fit to points along BC would accurately estimate the asymptote, but would be excluded by Lonsdale's screening. Density change is simply not a reliable indicator of how well a data set represents an asymptotic thinning line.

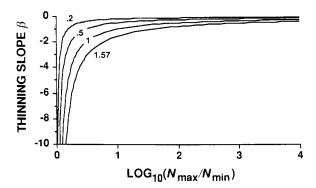


Fig. 2. The relationship of thinning slope to density change for four different levels of biomass increase [expressed as log  $(B_{\max}/B_{\min})$ ]. Given the thinning equation  $(B=kN^a)$ , density decreases from  $N_{\max}$  to  $N_{\min}$  as biomass increases from  $B_{\min}$  to  $B_{\max}$  and  $\beta = -\log(B_{\max}/B_{\min})/\log(N_{\max}/N_{\min})$ . This shape of the curves is a mathematical consequence of the thinning equation, so the fact that data follow the same pattern (Lonsdale 1990: Fig. 3) does not indicate the inclusion of pre-thinning data or justify a data-screening procedure.

mulate relatively more biomass to accompany a given decrease in density, and will probably need more time to do so. Biomass accumulation, growing time, and observation time are limited by biological and practical constraints. Therefore, observing thinning over a fixed percentage of density decrease becomes less-and-less likely as one considers populations with increasingly steep thinning slopes. Thinning slopes above a threshold value are completely excluded from observation (steeper than -3.2 for a half order of magnitude of density change). The bias also affects thinning slopes nearer the ideal value—the probability of exclusion would be higher among thinning slopes near -.7 than among slopes near  $-\frac{1}{2}$ . Because it is biased, Lonsdale's screening criterion does not solve the troublesome problem (Weller 1990) of objectively distinguishing thinning from non-thinning data.

Lonsdale's exclusion of examples based on total plant biomass reduced sample sizes and hence the power to detect systematic variation. These data were omitted because "claims for the generality of the self-thinning rule have been restricted to shoot biomass" and because Lonsdale disliked my comparison of totalbiomass and shoot-biomass thinning lines. In fact, total-biomass data were instrumental in establishing the self-thinning rule, providing 7 of 9 examples in Yoda et al. (1963), 3 of 6 examples of herbaceous species in White and Harper (1970), and at least 8 of 36 examples in White (1980). My comparison of total- and shootbiomass thinning lines was not wrong (as Lonsdale suggests) because I used it only to see if the two groups could be pooled in further analyses, not to test the selfevident hypothesis that a population's thinning line for

total biomass is higher than its shoot-biomass thinning line.

To avoid pseudoreplication, Lonsdale averaged replicates to produce a single datum for each species, further reducing sample sizes and the chances of detecting systematic variation. Although my simple nonparametric test for differences in thinning-line parameters among plant groups (Weller 1987a: Table 2) did confound two sources of variability (differences among plant groups and differences among species within groups), I am not convinced that this is a case of pseudoreplication (sensu Hurlburt 1984). However, we need not argue. An analysis of variance with species nested within plant groups (Sokal and Rohlf 1981) can resolve the two sources of variability, test differences among plant groups using only the variability among species (as Lonsdale desires), and still use the information contained in species replicates (as I desire). Analysis of my data base reveals significant differences among plant groups and significant differences among the species within groups (Table 1). Differences among species within groups persist after Lonsdale's screening, but the among-group differences become insignificant (Table 1). Since the treatment of replicates is consistent here, the different patterns of significance in the unscreened and screened data bases are strictly due to the screening procedure. This suggests that the screening procedure itself is primarily responsible for the differences between my results and Lonsdale's.

I am unconvinced by Lonsdale's case-by-case rebuttals of individual counterexamples of the thinning rule, but further argument over individual cases would be unproductive because the inherent subjectivity and ambiguity of thinning analysis (Lonsdale 1990, Weller 1990) preclude objectively resolving many differences of opinion. I will note that Lonsdale scrutinized and dismissed all cases that disagreed with the thinning rule, but did not focus the same critical eye on data which seemed to agree with the rule. This reveals an a priori bias that cannot be defended.

I would also like to clarify some points about my earlier papers. In Table A1 of Weller (1987a), Pinus pumila (code 128) should have  $n_s = 0$  (as noted by Lonsdale), while Medicago sativa/Trifolium pratense (code 57) should have  $n_s = 1$ . These errors arose only in preparing the table for publication and did not affect my results and conclusions. My thinning slope estimate for Populus deltoides (code 210) was not miscalculated (as suggested by Lonsdale), but was fit to data from the period of peak stand growth (Williamson 1913, Fowells 1965). Steeper estimates (White 1980, Lonsdale 1990) probably represent younger, pre-thinning stands (Weller 1985). I did not calculate coefficients of variation (cv) for log K incorrectly (Weller 1987a). Lonsdale's (1990:Tables 1 and 8) alternate calculation is wrong

486 9 8

TABLE 1. Nested analysis of variance for difference in thinning slope (single-species thinning lines only). Data were transformed to normality by the Box-Cox transformation (Sokal and Rohlf 1981) with power  $\lambda$ .

Effect	F (df)	P†	Variance componen (%)
All data (Weller 1987a:Table 2, exc	luding multispecies data)		
Experimental and field data ( $n = 0$ )	$69, \lambda = -0.245)$		
Plant group Species within group	4.07 (5, 19.1) 1.58 (38, 25)	.011 <b>*</b> .12	29 20
Forestry yield tables ( $n = 283, \lambda =$	= ~0.481)		
Plant group Species within group	5.86 (2, 30) 9.48 (30, 250)	.0071* <.0001*	42 29
After Lonsdale's screening $[log(N_{max})]$ Experimental and field data $(n = 1)$		]	
Plant group Species within group	1.08 (4, 12.4) 2.49 (18, 11)	.41 .062	2 53
Forestry yield tables ( $n = 142, \lambda =$	= 0.309)		
Plant group Species within group	1,25 (2, 16) 16.1 (16, 123)	.31 <.0001*	21 53

<sup>\*</sup> Significant at  $P \leq .05$ .

because it estimates the cv for untransformed values of K (see Snedecor and Cochran 1980) rather than the cv of log K. Finally, I do not accept  $-\frac{1}{2}$  as the precise slope of the interspecific biomass—density relationship. This slope is shallower than  $-\frac{1}{2}$  (see Weller 1989), but not because stem biomass rather than total biomass is measured for trees (as suggested by Lonsdale). In fact, 72% of the tree data sets from experimental and field studies (Weller 1987a) included branch mass, and 67% even included foliage mass. Weller (1989) reviews other possible explanations.

Lonsdale and I agree that biomass packing (mass per unit of occupied volume) is important in explaining size-density relationships. Lonsdale shows that changes in biomass packing with growth can account for much of the variability in the thinning slope. Earlier explanations focusing on changes in plant shape with growth may have emphasized a less-important factor. Perhaps this is why geometric models at best account for a small, but statistically significant, portion of the variability among thinning slopes, and why some studies have found no evidence of anticipated geometric effects (see review in Weller 1987b). Although less variable and closer to  $-\frac{1}{2}$ , the volume-density thinning slope is not necessarily a better or more lawlike statement of the size-density relationship than the mass-density slope. For plants with constant shape and biomass packing, the  $-\frac{1}{2}$  slope is a trivial geometric consequence of packing objects on a surface, while changes in shape or biomass packing with growth are predicted to cause deviations from  $-\frac{1}{2}$  (Weller 1987b, 1989).

The volume—density thinning slope is subject only to the lesser of these two sources of variability and is therefore closer to the trivial geometric statement than the biomass—density slope.

I have presented several reasons why Lonsdale's results may underestimate the evidence against the selfthinning rule. Although I do not accept all of Lonsdale's methods or interpretations. I believe that his results still provide sufficient evidence to reject the hypothesis of a single ideal thinning slope about which all variation is random. Lonsdale himself proposed that changes in biomass per unit volume explain much of the variability among mass-density thinning slopes. This hypothesis necessarily implies that real variability can be systematically attributed to another factor. Lonsdale discounted the other evidence of systematic variability. His reanalysis obliterated the differences in thinning slope among plant groups as well as the correlation of thinning slope with shade tolerance among angiosperms. The correlation of thinning slope with shade tolerance for gymnosperms persisted, but was dismissed by discarding a data point. However, the correlations of thinning slope with allometric measures of plant geometry could not be banished. Correlation certainly does not prove causation (Weller 1987b, Lonsdale 1990), but does reveal a systematic pattern of variability even if the correlated changes in thinning slope and plant allometry are only concomitant with some unknown cause. Although numerically small (possibly because variations in biomass packing are more important), the correlations remain statistically

<sup>†</sup> Significance of the plant group effect was tested using Satterthwaithe's approximation for the experimental and field data. The forestry-yield table data did not meet all the assumptions for Satterthwaithe's approximation, so the significance tests are based on a more approximate F test (Sokal and Rohlf 1981:300).

significant despite the biased data screening, and therefore provide very robust evidence of systematic variability.

The idea of single, ideal thinning slope seems rejected, not simply unsupported or untested. Therefore, future critical experiments (Weller 1987b, Lonsdale 1990) should not focus on retesting that hypothesis. but rather on relating variability in thinning slopes to other factors, such as changes in plant geometry (Weller 1987b) and biomass per unit volume (Lonsdale 1990). Such experiments may be difficult because explainable variations in the thinning line can arise even under controlled experimental conditions (Westoby and Howell 1986), and large data sets may be required to detect weak relationships (Weller 1987b). Hopefully these difficulties can be overcome, because we do need to move beyond the reanalysis of large collations of past data. This activity is clearly following a curve of diminishing marginal return.

Acknowledgments: This research was supported by the Smithsonian Environmental Research Center, the Smithsonian Environmental Sciences Program, and the Environmental Sciences Division of Oak Ridge National Laboratory. I thank Jake Weiner, Deborah Weller, W. M. Lonsdale, and one anonymous reviewer for helpful comments on the manuscript.

## Literature Cited

- Fowells, H. A. 1965. Silvics of forest trees of the United States. United States Department of Agriculture Handbook Number 271.
- Hurlburt, S. H. 1984. Pseudoreplication and the design of ecological field experiments. Ecological Monographs 54: 187-211.
- Lonsdale, W. M. 1990. The self-thinning rule: dead or alive? Ecology 71:1373-1388.
- Snedecor, G. W., and W. G. Cochran. 1980. Statistical methods. Iowa State University Press, Ames, Iowa, USA.
- Sokal, R. R., and F. J. Rohlf. 1981. Biometry. W. H. Freeman, San Francisco, California, USA.
- Weller, D. E. 1985. A mathematical and statistical analysis of the -3/2 power rule of self-thinning in even-aged plant

- populations. Dissertation. The University of Tennessee, Knoxville, Tennessee, USA. (Also available as Weller, D. E., R. H. Gardner, and H. H. Shugart, Jr. 1984. A mathematical and statistical analysis of the -3/2 power rule of self-thinning in even-aged plant populations. ORNL/TM-9548. Oak Ridge National Laboratory, Oak Ridge, Tennessee, USA.)
- 1987a. A reevaluation of the -3/2 power rule of plant self-thinning. Ecological Monographs 47:23-43.
- 1987b. Self-thinning exponent correlated with allometric measures of plant geometry. Ecology 68:813-821.
   1989. The interspecific size-density relationship and applications for the control of the control of
- among crowded plant stands and its implications for the -3/2 power rule of self-thinning. American Naturalist 133: 20-41.
- up?—a reply to Osawa and Sugita. Ecology 71:1204–1207.
- Westoby, M. 1976. Self-thinning in *Trifolium subterraneum* not affected by cultivar shape. Australian Journal of Ecology 1:245–247.
- ——. 1984. The self-thinning rule. Advances in Ecological Research 14:167–255.
- Westoby, M., and J. Howell. 1986. Influence of population structure on self-thinning in plant populations. Journal of Ecology 74:343-359.
- White, J. 1980. Demographic factors in populations of plants. Pages 21-48 in O. T. Solbrig, editor. Demography and evolution in plant populations. University of California Press, Berkeley, California, USA.
- White, J., and J. L. Harper. 1970. Correlated changes in plant size and number in plant populations. Journal of Ecology 58:467–485.
- Williamson, A. W. 1913. Cottonwood in the Mississippi Valley. United States Department of Agriculture Bulletin 24.
- Yoda, K., T. Kira, H. Ogawa, and K. Hozumi. 1963. Self-thinning in overcrowded pure stands under cultivated and natural conditions (intraspecific competition among higher plants XI). Journal of the Institute of Polytechnics, Osaka City University, Series D14:107-129.
- Zeide, B. 1985. Tolerance and self-tolerance of trees. Forest Ecology and Management 13:149-166.
- ——. 1987. Analysis of the 3/2 power law of self-thinning. Forest Science 33:517-537.

Manuscript received 25 January 1990; revised 8 September 1990; accepted 10 September 1990; final version received 5 October 1990.