## Analysis of Pressure-volume Data Using Segmented, Nonlinear Regression Algorithms

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Pressure-volume methodology has been used extensively to study water relations of plant tissues. Measurements of tissue water potential  $(\Psi)$  are typically collected over a range of relative water contents (R) from saturation to well below the point of turgor loss. The methodology for collecting these data and the theoretical basis for interpreting the resulting curves have been discussed by Cheung et al. (1975).

Recently, nonlinear regression algorithms have been presented for fitting the entire pressure-volume curve as opposed to just the region below the point of turgor loss (Schulte and Hinckley, 1985). Herein we present one approach for analyzing pressure-volume data using a segmented, nonlinear regression program specifically written for the Statistical Analysis System (SAS, SAS Institute, Inc., Caxy, N.C.). The NLIN procedure in SAS is well suited for segmented, nonlinear regression analysis.

Use of a nonlinear, regression algorithm for fitting of curves requires selection of an appropriate mathematical model. Given that  $\Psi = \psi_\pi + \psi_p$ ,  $\Psi$  can be described by the sum of its components, osmotic potential  $(\psi_\pi)$  and  $\psi_p$ , and each as a function of R. The osmotic component can be defined, based on theoretical considerations, and has been given by Schulte and Hinckley (1985):  $\psi_\pi = \psi_{\pi, \text{sat}}/(1 - ((1 - R/X)))$ , where  $\psi_\pi$ ,  $_{\text{sat}}$  is the osmotic potential at full saturation and X is the symplastic fraction of water at saturation.

The  $\psi_s$  component is more difficult to define because  $\psi_s$  is influenced by tissue elasticity and R and their relationships are somewhat unclear (Cheung et al., 1976). Various exponential functions, however, have been found to provide good empirical fits to pressure-volume data (Cheung et al., 1976).

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Schulte and Hinckley (1985) have presented the modified exponential function:  $\psi_p = \exp^{a(R-R_0)} - 1$ , where "a" is a constant and R, is the R at the point of turgor loss. Modulus of elasticity, defined in terms of R, has been derived by Schulte and Hinckley (1985) as  $E = (R - R_0) d\bar{\psi}_p / dR$ , where  $R_o$  is the apoplastic water fraction at saturation and is equal to 1 - X. When using the modified exponential equation for  $\psi_p$ , differentiation of E will give: E = a + a&. The maximum E (determined at full turgor) can be easily calculated using the differentiated equation for E and by substituting  $-\psi_{\pi,sat}$  for  $\psi_p$ .

A SAS program, with the general model  $\Psi = \psi_{\pi} + \psi_{p}$ , using the aforementioned

equations for  $\psi_{\pi}$  and  $\psi_{\pi}$ , is given as one approach for analyzing pressure-volume data (Fig. 1). However, different equations for  $\Psi_{\pi}$  may provide better fits depending on the species and tissue type. Precautions and problems associated with nonlinear regression analysis are discussed by Bates and Watts (1988) and SAS (1988).

Users should be aware that the shape of the E vs.  $\psi$  relationship depends on the model selected for  $\psi$  (Schulte and Hinckley, 1985). Thus, for certain studies where E and its relationship to other variables are of primary interest, care should be taken in selecting models and interpreting their output.

Copies of this and other programs (e.g., a power function) for analyzing pressure-volume data are available on diskette by sending a formatted DOS diskette to T.G.R. at the above address.

## **Literature Cited**

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TITLE 'MODIFIED EXPONENTIAL MODEL'; DATA MEXPO; INFILE 'A:PV.DTA': INPUT WP FWT SATWT DRYWT; /\* WP = water potential (a negative value), FWT = tissue weight at that WP, SATWT = saturated tissue weight, and DRYWT = tissue dry weight\*/; R=(FWT-DRYWT)/(SATWT-DRYWT); WSD=1-R; /\*R = relative water content and WSD = water saturation deficit\*/; PROC NLIN BEST=1 METHOD=MARQUARDT; BOUNDS SIPISAT < 0, A > 0, 1 > X > 0, 1 > RTLP > 0; PARMS SIPISAT = -2.8 TO -1.0 BY .2 X = .6 TO 1.0 BY .1 A = 2 TO 12 BY 2RTLP = .80 TO .95 BY .025; RILP = .80 10 .95 BY .025; /\*Initial grid search. Ranges should straddle expected values. SIPISAT = osmotic potential at full turgor  $(\psi_{\bullet,aa})$ , X = symplastic water fraction at saturation, A = constant, and RTLP = relative water content at the point of turgor loss  $(R_0)^*$ ; TURGOR = EXP(A\*(R-RTLP))-1; SIPI = SIPISAT/(1-((1-R)/X));IF R>RTLP THEN DO; MODEL WP=SIPI+TURGOR: DER.SIPISAT = 1/(1-((1-R)/X)); DER.A = (R-RTLP)\*EXP(A\*(R-RTLP));DER.RTLP = -A\*EXP(A\*(R-RTLP));DER.X = -(SIPISAT\*(1-R))/((1-((1-R)/X))\*\*2\*X\*\*2);END: ELSE DO; MODEL WP=SIPI; DER.SIPISAT=1/(1-((1-R)/X)); DER.X= -(SIPISAT\*(1-R))/((1-((1-R)/X))\*\*2\*X\*\*2); OUTPUT OUT = BOZO P=YHAT R=YRESID PARMS = SIPISAT X A RTLP; PROC PLOT uniform vpercent=200; PLOT WP\*WSD='\*' YHAT\*WSD='P'/overlay; PLOT YRESID\*WSD/VREF=0; DATA GONZO; SET BOZO; EMAX = A + (A \* -SIPISAT); WPTLP = SIPISAT/(1-((1-RTLP)/X));SIPI = SIPISAT/(1-((1-R)/X)); TURGOR = WP-SIPI;/\* WPTLP = water potential at the point of turgor loss and and EMAX = maximum bulk modulus of elasticity\*/ PROC PRINT; VAR WP WSD SIPI TURGOR SIPISAT X A RTLP WPTLP EMAX;

Fig. 1. A PC SAS program for analyzing pressure-volume data using the NLIN procedure with a modified exponential model for fitting the positive turgor portion of the curve.