

---

THE ENTROPY METHOD OF ACCUMULATING EVIDENCE  
OF MEETING A RELIABILITY GOAL BY VARIOUS TYPES OF TESTS

---

INTRODUCTION

In engineering testing programs we come across various types of tests , including

- (a) Components Tests
- (b) Assembly Tests
- (c) Prototype Tests
- (d) Proving Ground Tests
- (e) Accelerated Lab. Tests

The most frequent question asked about such testing programs is the following :

QUESTION : How can we combine all of the results we obtain from these tests into a composite index of confidence that we are meeting the reliability goal for the product being tested ?

THE NECESSARY FACTORS IN THE STUDY

There are certain necessary factors which must be available if we are to determine a composite confidence index of meeting reliability goals . These are :

- I : We must know the Field Goal Line .
- II : We must know how the Goal Line changes for each test condition different from field conditions .
- III : We must know how to put together component reliabilities into assembly reliabilities .



I : THE FIELD GOAL LINE

The Field Goal Line is simply a line (or curve) on Weibull paper which describes a satisfactory product life in the hands of the customer . For example , in Figure 1 we show a Field Goal Line for an automotive muffler with a  $B_{10}$  life of 20,000 miles and a Weibull slope of 3.5 . In order to be at least as good as this Goal Line a data plot of field failures of mufflers must show a Weibull line to the right of this Field Goal Line .

II : GOAL LINE CHANGES WITH TEST TYPE

Anytime we test in a fashion not actually in the field we must know how the Field Goal Line is shifted to agree with the actual test conditions . For example , if life varies inversely as the  $m^{\text{th}}$  power of stress (or other severity factors) , we can state that

$$\text{LIFE} = \frac{\text{constant}}{(\text{stress})^m} \quad (1)$$

Now suppose, for example , that  $m = 4$  , and that a certain test increases the stress 20% above the field condition stress . Then the Life Conversion Factor for reducing the Goal Line to the actual test conditions would be the Conversion Factor =  $(1.2)^4 = 2.0736$  , . i. e.

$$\text{TEST LIFE} = \frac{\text{FIELD LIFE}}{2.0736} \quad (2)$$

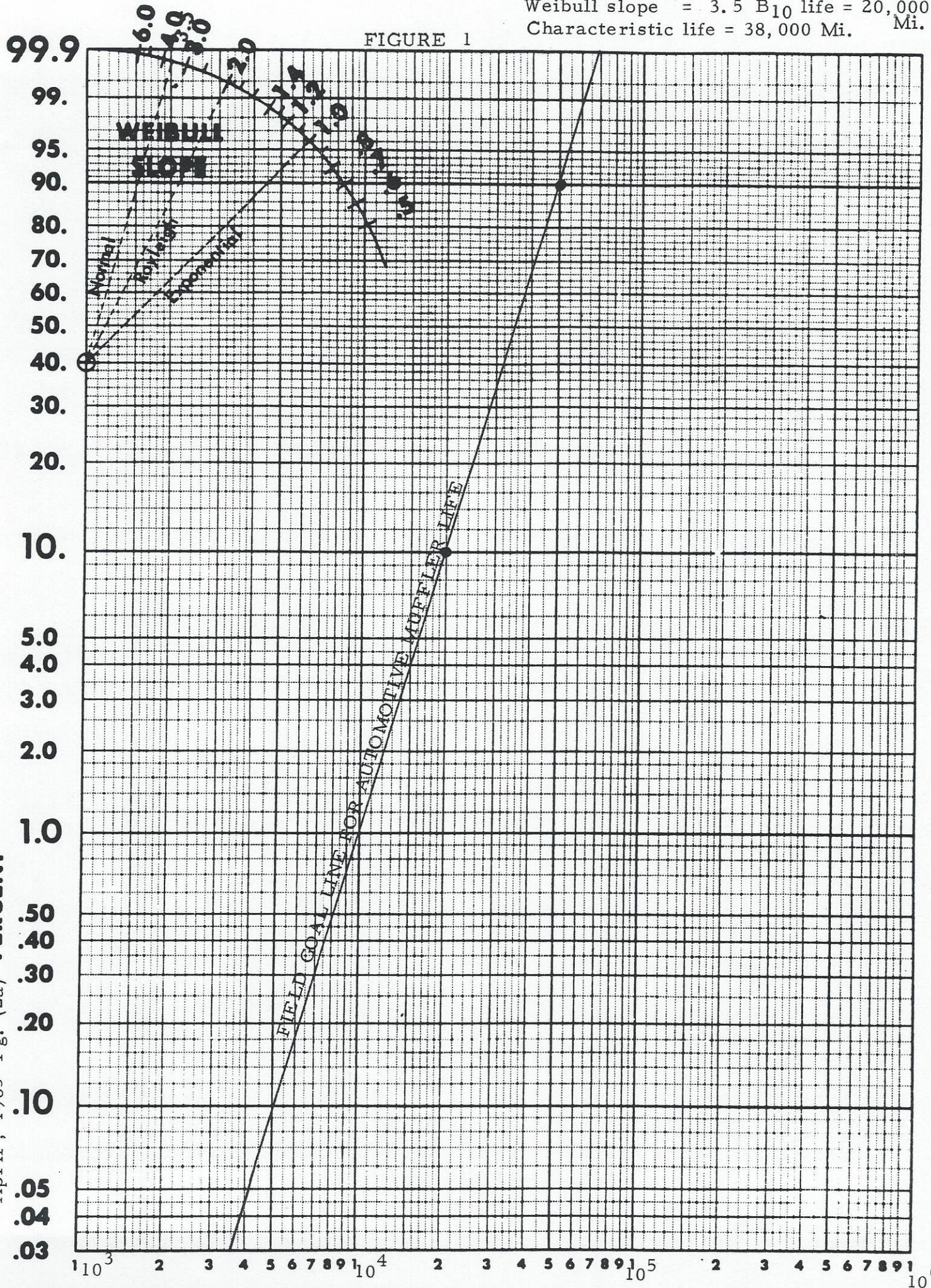
Thus , the Goal Line for this test on Weibull paper would show life values which are equal to

$$\frac{\text{Field Goal Values}}{2.0736}$$



Weibull slope = 3.5 B<sub>10</sub> life = 20,000 Mi.  
Characteristic life = 38,000 Mi.

FIGURE 1





THE ENTROPY METHOD OF EVALUATION

In the evaluating test data with respect to a Goal Line on Weibull paper we take the actual test data points at  $x_1, x_2, x_3, \dots, x_N$  and calculate the Entropy Total as follows :

$$\begin{aligned} \epsilon_{\text{total}} = & \left( \frac{x_1}{\theta_{\text{test goal}}} \right)^{b_{\text{test goal}}} + \left( \frac{x_2}{\theta_{\text{test goal}}} \right)^{b_{\text{test goal}}} + \dots + \left( \frac{x_N}{\theta_{\text{test goal}}} \right)^{b_{\text{test goal}}} \end{aligned} \quad (3)$$

Where

$b_{\text{test goal}}$  = Test Goal Line Weibull slope

$\theta_{\text{test goal}}$  = Test Goal Characteristic Life

In case  $r$  out of the  $N$  test points ( $x_1, x_2, x_3, \dots, x_N$ ) are failures , then divide the Entropy Total by  $r$  to obtain the AVERAGE ENTROPY PER FAILURE

$$\epsilon_{\text{ave.}} = \frac{\epsilon_{\text{total}}}{r} \quad (r \geq 1) \quad (4)$$

[In case  $r = 0$  (no failures), simply use  $\epsilon_{\text{total}}$ ]

HOW TO CALCULATE EVIDENCE

EVIDENCE , In a mathematical sense , is defined as follows :

$$EVIDENCE = \ln (c/1 - c) \tag{5}$$

Where  $c$  = Confidence of meeting the goal

$1 - c$  = Confidence against meeting the goal

so, the ratio  $(c/1 - c)$  = Odds in Favor of meeting the goal .

Thus , we can state that  $EVIDENCE = \ln (ODDS)$  (6)

In case we have several tests (say  $k$  of them) with failures, we can calculate the average Entropy per failure in each of the  $k$  tests as follows :

$${}_1 E_{ave.} = \frac{{}_1 E_{total}}{r_1} \quad (r_1 \text{ failed in Test 1})$$

$${}_2 E_{ave.} = \frac{{}_2 E_{total}}{r_2} \quad (r_2 \text{ failed in Test 2})$$

⋮

$${}_k E_{ave.} = \frac{{}_k E_{total}}{r_k} \quad (r_k \text{ failed in Test } k)$$

To calculate the EVIDENCE from the first test , evaluate the formula

$$E_1 = \frac{\pi}{\sqrt{3}} \sqrt{r_1} ({}_1 E_{ave.} - 1) \quad \left( \begin{array}{l} \text{First Test's} \\ \text{Evidence} \end{array} \right)$$

Likewise , from test # 2 :

$$E_2 = \frac{\pi}{\sqrt{3}} \sqrt{r_2} ({}_2 E_{ave.} - 1) \quad \left( \begin{array}{l} \text{Second Test's} \\ \text{Evidence} \end{array} \right)$$

⋮

Finally , from test #  $k$  :

$$E_k = \frac{\pi}{\sqrt{3}} \sqrt{r_k} ({}_k E_{ave.} - 1) \quad \left( \begin{array}{l} \text{k}^{th} \text{ Test's} \\ \text{Evidence} \end{array} \right)$$

Then , the TOTAL EVIDENCE from all  $k$  tests is

$$\hat{E} = E_1 + E_2 + \dots + E_k \tag{7}$$

and , the Total Confidence of meeting the goal of reliability for the product tested is

$$\hat{c} = 1/(1 + e^{-\hat{E}}) \quad \text{[inverse of (5)]} \tag{8}$$



IN CASES OF TESTS WITHOUT FAILURES

The Evidence Accumulation is modified whenever we have a test without any failures by using only the ENTROPY TOTAL,  $\mathcal{E}_{total}$ , instead of the Average Entropy per Failure,  $\mathcal{E}_{ave}$ . However, when we do this ( i.e., use  $\mathcal{E}_{total}$  instead of  $\mathcal{E}_{ave}$ .), the formula for the corresponding Evidence for such a test without failures is

$$EVIDENCE = E = \ln \left[ e^{\mathcal{E}_{total}} - 1 \right] \tag{9}$$

So, whenever a certain test exhibits a certain number of life values ( $x_1, x_2, \dots, x_N$ ) without failures, we simply calculate

$$\begin{aligned} \mathcal{E}_{total} = & \left( \frac{x_1}{\theta_{test\ goal}} \right)^{b_{test\ goal}} + \left( \frac{x_2}{\theta_{test\ goal}} \right)^{b_{test\ goal}} + \\ & \left( \frac{x_3}{\theta_{test\ goal}} \right)^{b_{test\ goal}} + \dots + \left( \frac{x_N}{\theta_{test\ goal}} \right)^{b_{test\ goal}} \end{aligned} \tag{10}$$

and then the Evidence from that test is given by Formula (9), and that Evidence goes into the total Equation (7).



NUMERICAL EXAMPLE OF THREE TESTS

<u>TEST NO. 1</u> (Stress = 80,000 psi)	<u>TEST NO. 2</u> (Stress = 90,000 psi)	<u>TEST NO. 3</u> (Stress = 75,000 psi)
Goal Line $b_1 = 1.5$	Life Divisor = $(90000/80000)^7$	Life Divisor = $(75000/80000)^7$
Parameters $\theta_1 = 1000$ hrs.	= 2.2807	= .63650
	Transformed Goal :	Transformed Goal :
	$b_2 = 1.5$	$b_3 = 1.5$
	$\theta_2 = 438.46$ hrs.	$\theta_3 = 1571.09$ hrs.
<u>TEST DATA</u>	<u>TEST DATA</u>	<u>TEST DATA</u>
$x_1 = 1050$ hrs. (unfailed)	$x_1 = 400$ hrs. (failed)	$x_1 = 1750$ hrs. (unfailed)
$x_2 = 975$ hrs. (failed)	$x_2 = 750$ hrs. (failed)	$x_2 = 1150$ hrs. (unfailed)
$x_3 = 1200$ hrs. (failed)	$x_3 = 300$ hrs. (failed)	$x_3 = 2000$ hrs. (unfailed)
$x_4 = 1440$ hrs. (unfailed)	$x_4 = 525$ hrs. (unfailed)	( $r_3 = 0$ failures)
( $r_1 = 2$ failures)	$x_5 = 250$ hrs. (unfailed)	
	( $r_2 = 3$ failures)	

We want to find the composite confidence of meeting the goal for the reliability of this product , having given (from previous experimentation) , that

$$\text{LIFE} = \frac{\text{CONSTANT}}{(\text{STRESS})^7}$$

Since the stress in Test No. 2 is 90,000 psi , we calculate

$$\theta_2 = \frac{\theta_1}{(90,000/80,000)^7} = 438.46 \text{ hrs. , with the same slope } 1.5$$

Since the stress in Test No. 3 is 75,000 psi , we calculate

$$\theta_3 = \frac{\theta_1}{(75,000/80,000)^7} = 1571.09 \text{ hrs. , with the same slope } 1.5$$



CALCULATING EACH TEST EVIDENCE AND THE TOTAL EVIDENCE AND THE RESULTANT ACCUMULATED CONFIDENCE OF MEETING THE PRODUCT'S GOAL

TEST NO. 1

$$\begin{aligned} (\text{Entropy Total})_1 &= {}_1\mathcal{E}_{\text{total}} = \left(\frac{1050}{1000}\right)^{1.5} + \left(\frac{975}{1000}\right)^{1.5} + \left(\frac{1200}{1000}\right)^{1.5} + \left(\frac{1440}{1000}\right)^{1.5} \\ &= 5.08120 \quad (r_1 = 2 \text{ failures}) \end{aligned}$$

$${}_1\mathcal{E}_{\text{ave.}} = {}_1\mathcal{E}_{\text{total}} / 2 = 5.08120 / 2 = 2.54060$$

$$\text{Evidence}_1 = E_1 = \frac{\pi}{\sqrt{3}} \sqrt{2} (1.54060) = 3.95178$$

TEST NO. 2

$$\begin{aligned} (\text{Entropy Total})_2 &= {}_2\mathcal{E}_{\text{total}} = \left(\frac{400}{438.46}\right)^{1.5} + \left(\frac{750}{438.46}\right)^{1.5} + \left(\frac{300}{438.46}\right)^{1.5} + \left(\frac{525}{438.46}\right)^{1.5} \\ &= \left(\frac{250}{438.46}\right)^{1.5} = 5.41523 \quad (r_2 = 3 \text{ failures}) \end{aligned}$$

$${}_2\mathcal{E}_{\text{ave.}} = {}_2\mathcal{E}_{\text{total}} / 3 = 5.41523 / 3 = 1.80508$$

$$\text{Evidence}_2 = E_2 = \frac{\pi}{\sqrt{3}} \sqrt{3} (1.80508) = 2.52923$$

TEST NO. 3

$$\begin{aligned} (\text{Entropy Total})_3 &= {}_3\mathcal{E}_{\text{total}} = \left(\frac{1750}{1571.09}\right)^{1.5} + \left(\frac{1150}{1571.09}\right)^{1.5} + \left(\frac{2000}{1571.09}\right)^{1.5} \\ &= 3.23813 \quad (r_3 = 0 \text{ failures}) \end{aligned}$$

$$\text{Evidence}_3 = E_3 = \ln [e^{3.23813} - 1] = 3.19810$$

Thus , TOTAL EVIDENCE =  $\hat{E} = E_1 + E_2 + E_3 = 9.67911$  ,

and the resultant confidence of meeting the reliability goal is

$$\hat{c} = \frac{1}{1 + e^{-9.67911}} = .99974 \quad (\text{ans.})$$



CONCLUSION

We have shown a technique for accumulating evidence from a collection of tests under different conditions (with corresponding goal lines) . This technique , known as the ENTROPY METHOD , is very useful and easily applied , and involves no more than two basic principles , which are

PRINCIPLE I : DAMAGE due to service is measured by ENTROPY .

PRINCIPLE II : The TOTAL EVIDENCE is the ALGEBRAIC SUM of individual evidence from separate tests.