

APPLIED MATHEMATICS AND STATISTICS LABORATORIES

**STANFORD UNIVERSITY
CALIFORNIA**

**AN OPTIMAL SEQUENTIAL ACCELERATED LIFE TEST
WITH EXPONENTIAL DEPENDENCE ON STRESS**

By

GIDEON SCHWARZ

TECHNICAL REPORT NO. 67

December 12, 1960

**PREPARED UNDER CONTRACT Nonr-225(52)
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**FOR
OFFICE OF NAVAL RESEARCH**



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Summary:

In [1] Bessler, Chernoff and Marshall present a method for obtaining optimal sequential designs for experiments to test whether a device subjected to standard stress has an expected lifetime exceeding a specified value. It is assumed there that the lifetime is exponentially distributed, with expectation a function of the stress and an unknown parameter. The case in which that function is the inverse of a quadratic is solved in [1] explicitly.

In the present paper, the same method is applied to the case where the dependence of the expected lifetime on the stress is exponential.

Formulation of the game:

A random variable T , the life-time, is exponentially distributed on the positive half-line, and its unknown mean μ is related to the stress x and to two unknown parameters ϕ_1 and ϕ_2 through the formula $\mu = e^{-\phi_1 x - \phi_2}$. We wish to test a one-sided hypothesis about the mean life-time at "normal stress". The stress scale can be chosen so that normal stress = zero, and the time scale so that we are testing $\mu \geq 1$ against $\mu \leq 1$. With those choices, the hypotheses are equivalent to $\phi_2 \leq 0$ and $\phi_2 \geq 0$ respectively. We assume that ϕ_2 can take on any value, while ϕ_1 is restricted to non-negative values. The available stress-levels x are assumed to be all numbers up to a positive given maximal stress K .

According to [1], the choice of the stress level for the next experiment is determined by an optimal strategy for the first (i.e., maximizing) player in a game (X, Y, F) , in which the available strategies for the first player are the stress levels, and for the second player, the parameter points in the hypothesis alternative to the one including (θ_1, θ_2) , the maximum likelihood estimate of (φ_1, φ_2) from the observations taken so far. The payoff is given by

$$F(x, \varphi_1, \varphi_2) = \frac{I(x, \theta_1, \theta_2, \varphi_1, \varphi_2)}{\mu(\bar{x}, \theta_1, \theta_2)} .$$

Here $I(x, \theta_1, \theta_2, \varphi_1, \varphi_2)$ is the Kullback-Leibler information number (cf. [2]) between the distribution of T with $\mu(x, \theta_1, \theta_2)$ and with $\mu(x, \varphi_1, \varphi_2)$.

Denoting $\varphi = \varphi_1 x + \varphi_2$ and $\theta = \theta_1 x + \theta_2$ we have $\theta - T e^\theta$ and $\varphi - T e^\varphi$ for the logarithms of the two densities. We therefore have $I(x, \theta_1, \theta_2, \varphi_1, \varphi_2) = \theta - \varphi + e^{-\theta}(e^\varphi - e^\theta)$ and, finally

$$F(x, \varphi_1, \varphi_2) = e^\theta [e^{\varphi - \theta} - \varphi + \theta - 1] .$$

Solution of the game:

We start by showing that the set of nature's strategies can be restricted to the set of parameter points on the common boundary of the hypotheses. Denoting the expression of $F(x, \varphi_1, \varphi_2)$ in terms of φ and θ by $F(\varphi, \theta)$, we have $\frac{\partial^2 F}{\partial \varphi^2} = e^\varphi > 0$. Thus F is convex in φ , and as φ is linear in (φ_1, φ_2) , F is convex in (φ_1, φ_2) . From its definition as

a ratio of two non-negative quantities, F is non-negative. At the point $(\varphi_1, \varphi_2) = (\theta_1, \theta_2)$ F is zero, and therefore it can only increase along any ray starting from (θ_1, θ_2) . Thus, for any strategy (φ_1, φ_2) the point at which the interval from (φ_1, φ_2) to (θ_1, θ_2) intersects the boundary $\varphi_2 = 0$, will have smaller or equal payoff than (φ_1, φ_2) for any x . The points on the boundary can be written as $(y, 0)$.

The game is thus reduced to a game in the plane, with $X = \{x | -\infty < x \leq K\}$ $Y = \{y | 0 < y < \infty\}$ and payoff function, which we again denote by F ,

$$F(x, y) = e^\theta [e^{\varphi - \theta} - \varphi + \theta - 1]$$

were now $\theta = \theta_1 x + \theta_2$ and $\varphi = xy$. We shall also use z , to denote $\varphi - \theta = (y - \theta_1) x - \theta_2$. We then have $F = e^\theta (e^z - z - 1)$, and $\frac{\partial z}{\partial x} = y - \theta_1$, and $\frac{\partial z}{\partial y} = x$.

In order to solve the game, we determine the points where for constant y , F attains a maximum with respect to x .

Differentiating F with respect to x we have

$$\frac{\partial F}{\partial x} = [(e^z - 1) y - \theta_1 z] e^\theta.$$

Setting $\frac{\partial F}{\partial x}$ equal to zero, we find $(e^z - 1) y = \theta_1 z$, hence the derivative is zero when $z = 0$ and also when

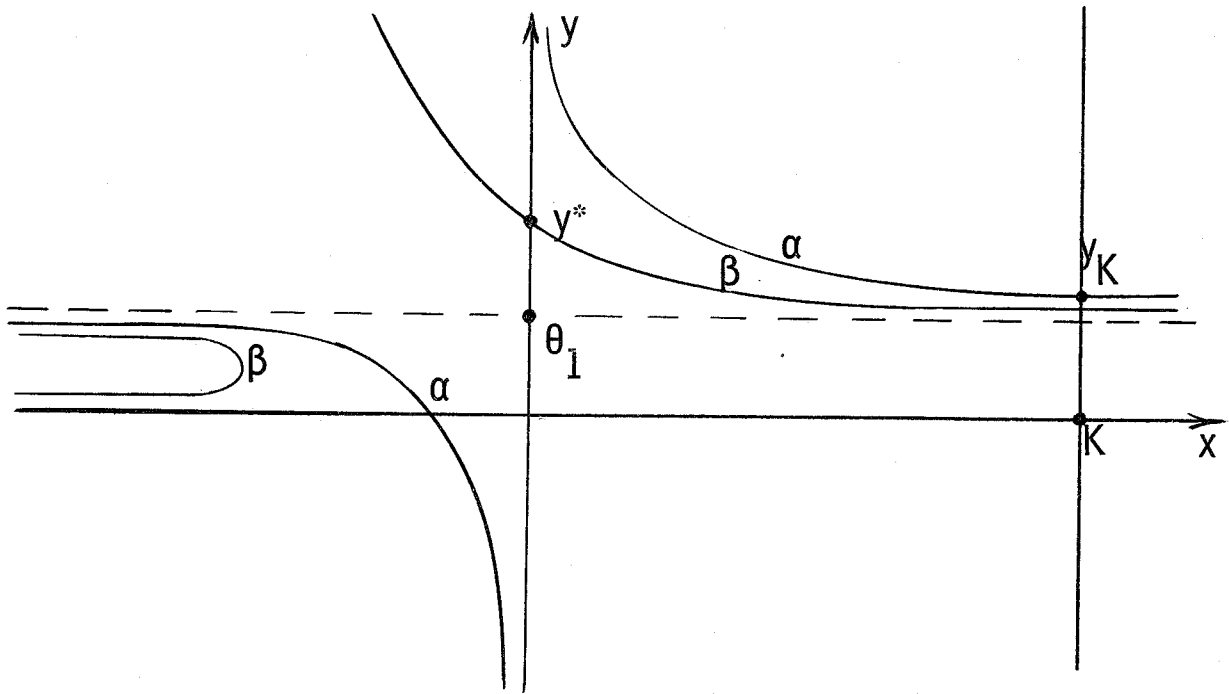
$$y = \frac{\theta_1 z}{e^z - 1}.$$

The first curve, $z = 0$, is a hyperbola $(x - k_0)(y - \theta_1) = \theta_2$. On this hyperbola $F(x, y) = 0$, and as F is non-negative, it has a minimum at every point of the hyperbola. The second curve, given by $y = \theta_1 z / (e^z - 1)$ intersects every line $y = \text{constant} > 0$ exactly once, with the exception of the the line $y = \theta_1$, which it never intersects. This follows from the fact that the function $z / (e^z - 1)$ is defined, positive and decreasing for all z . Its inverse function $g(t)$ is defined for all $t > 0$, and the equation $z = g(y/\theta_1)$ assigns a z to every positive y . As we have $z = (y - \theta_1)(x - k_0) - (\theta_1 k_0 + \theta_2)$ there is a unique x corresponding to given y and z , when $y \neq \theta_1$; that x is the abscissa of the unique intersection of $y = \text{constant} \neq \theta_1$ with $y = \theta_1 z / (e^z - 1)$. On the other hand, if $y = \theta_1$, we have $z = -\theta_2 \neq 0$, while $y = \theta_1 z / (e^z - 1)$ can equal θ_1 only for $z = 0$.

As every line $y = \text{constant} > 0$ intersects both the hyperbola and the curve $y = \theta_1 z / (e^z - 1)$, except the line $y = \theta_1$, and as the curve and the hyperbola never intersect, the payoff function has a unique local maximum on every line $y = a \neq \theta_1$, and that maximum is attained at $x(a)$, the solution of

$$a = \theta_1 z(x, a) / (e^{z(x, a)} - 1) .$$

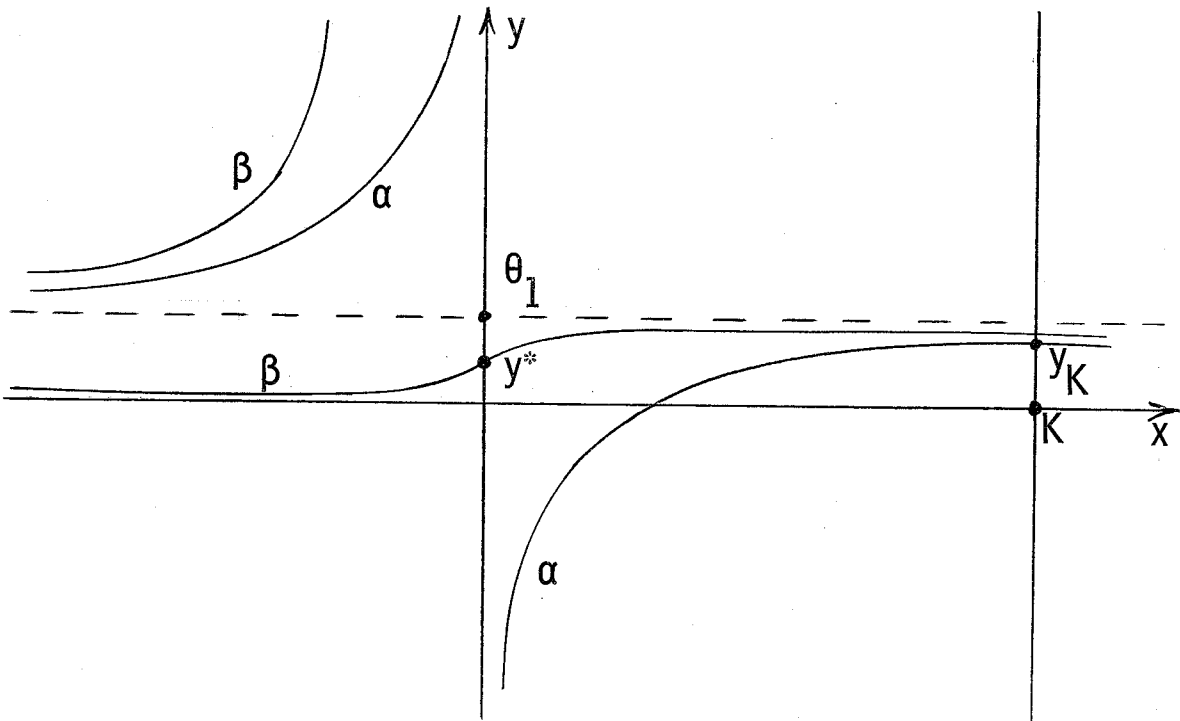
As for x decreasing indefinitely $F(x, y)$ tends to zero, the behaviour of $F(x, y)$ along $y = a \neq \theta_1$ is as follows: it increases when x increases from $-\infty$ to $x(a)$, then it decreases till the hyperbola is



The locus of $\frac{\partial F}{\partial x} = 0$ when $\theta_2 > 0$

α - the hyperbola

β - the curve $y = \theta_1 z / (e^z - 1)$



The locus of $\frac{\partial F}{\partial x} = 0$ when $\theta_2 < 0$

α - the hyperbola

β - the curve $y = \theta_1 z / (e^z - 1)$

crossed, after which it increases again. As x is limited to values less than or equal to K , the absolute maximum of $F(x, a)$ is attained either at $(x(a), a)$ or at (K, a) .

In general, a line $x = \text{constant}$ may cross the curve $y = \theta_1 z / (e^z - 1)$ more than once, or not at all; however, the line $x = 0$ crosses the curve exactly once. For $x = 0$ we have $z = -\theta_2$, which is independent of y , and the unique intersection with the curve is at

$$(*) \quad y^* = \frac{-\theta_1 \theta_2}{e^{-\theta_2} - 1}.$$

Now consider the two lines $x = 0$ and $y = y^*$. On the first one z , and therefore $F(x, y)$, are constant. On the second one, the maximum of $F(x, y)$ is attained at $(0, y^*)$ or at (K, y^*) . Assuming $F(K, y^*) < F(0, y^*)$, the maximum is attained at $(0, y^*)$, and the point $(0, y^*)$ is a saddle-point solution to the game. It is then a unique solution, because minima with respect to y are obtained for $x \neq 0$ only on the hyperbola, and on the hyperbola $F \equiv 0$, while $F(0, y^*) \neq 0$, and F must be the same at all saddle-points.

Summarizing, we see that y^* as defined by (*) is the unique optimal strategy for nature when $F(0, y^*) > F(K, y^*)$, and in that case $x = 0$, that is, using the normal stress is the unique optimal strategy for the statistician.

Let us now consider the alternative case, that is, $F(0, y^*) \leq F(K, y^*)$. The geometrical configuration depends on whether θ_2 is positive or negative, but we shall treat both cases simultaneously by adding the words appropriate to the case of negative θ_2 in parentheses whenever necessary. First, from the definition of y^* , y^* is positive (negative), and as the hyperbola is confined to the first and third (second and fourth) quadrants, the line $y = y^*$ intersects the hyperbola in the first (fourth) quadrant, that is, for some $x_0 > 0$. The term "quadrant" is used here in terms of the coordinates x and $y - \theta_1$ (cf. figure). As $F(x, y^*)$ has no stationary points except 0 and x_0 , we have $0 < F(x, y^*) < F(0, y^*)$ for $0 < x < x_0$, and the assumed inequality $F(K, y^*) \geq F(0, y^*)$ is possible only if $K \geq x_0$. The point (K, y^*) is therefore on or above (on or below) the hyperbola. Equivalently, if we denote by y_K the ordinate of the intersection of the hyperbola with the line $x = K$, y_K will be greater or equal (smaller or equal to y^*). We shall now prove that some number between y_K and y^* is the unique optimal strategy for nature. As $F(x, y)$ is convex in y , such a strategy exists, and equals that value of y for which $\max_x F(x, y)$ attains its minimum. We start therefore by studying the behaviour of $F(x, y)$ on the line $x = K$ and on the curve $y = \theta_1 z / (e^z - 1)$, the line and the curve being the only locations where maxima with respect to x can be attained.

First, on the line $x = K$, $F(x, y) \equiv F(K, y)$ is convex and therefore increasing for $y > y_K$ and decreasing for $y < y_K$. In particular, in the interval with end-points y_K and y^* , $F(K, y)$ is increasing (decreasing).

Second, on the curve $y = \theta_1 z / (e^z - 1)$ the partial derivative $\frac{\partial F}{\partial x}$ vanishes, and $\frac{dF}{dy} = \frac{\partial F}{\partial y}$; hence, moving along the curve by increasing y , F is increasing above the hyperbola and decreasing below it.

Combining those two facts, we see that for values of y greater (smaller) than y^* , both $F(K, y)$ and F along the curve are increasing (decreasing), and it is $\max_x F(x, y)$; for values of y smaller (greater) than y_K , both are decreasing (increasing), and, again, so is $\max_x F(x, y)$. Accordingly, nature's best strategy must be found between y_K and y^* .

To obtain an equation for nature's best strategy \hat{y} we observe that as along the line $x = K$, the function F increases from zero to $F(K, y^*) > F(0, y^*)$ as y goes from y_K to y^* (decreases from $F(K, y^*) > F(0, y^*)$ to zero as y goes from y^* to y_K), while along the curve, for the same values of y , F increases to $F(0, y^*)$ (decreases from $F(0, z^*)$), the two must meet at some y in between, and for that y , $\max_x F(x, z)$ attains its minimum. Equating $F(x, y)$ on the line $x = K$ and on the curve $y = \theta_1 z / (e^z - 1)$, we obtain the following procedure for calculating \hat{y} : denote again by $g(t)$ the inverse function of $z / (e^z - 1)$, the x -coordinate of a point on $y = \theta_1 z / (e^z - 1)$ is given by

$$\frac{g(y/\theta_1) + \theta_2}{y - \theta_1}$$

and the number \hat{y} is the solution of the equation $F(K, y) = F\left(\frac{g(y/\theta_1) + \theta_2}{y - \theta_1}, y\right)$ that lies between y_K and y^* .

Once \hat{y} has been found, the optimal strategy for the statistician is easily obtained.

It will consist, according to theorem 12.5 of [3], of randomizing between the two values of x for which $F(x, \hat{y})$ is maximal, that is, the values K and

$$x = \frac{g(\hat{y}/\theta_1) + \theta_2}{\hat{y} - \theta_1}, \text{ with weights whose ratio equals}$$

$$-\frac{\partial F(\hat{x}, \hat{y})}{\partial y} \Big/ \frac{\partial F(K, \hat{y})}{\partial y}.$$

As (x, y) and (K, y) lie on different sides of the hyperbola, this ratio is positive, as required by theorem 12.5 of [3]

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