



## APPROXIMATION OF FATIGUE CURVE AND FATIGUE LIMIT OF FIBRE COMPOSITE USING RANDOM DANIELS' SEQUENCE AND MARKOV CHAINS

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**Abstract.** The possibility of using a model based on random Daniels' sequence and Markov chain theory for approximation of S-N fatigue curve of fiber reinforced material is studied. The model allows observing the connection between static strength distribution parameters and parameter of S-N fatigue curve. Although the model is too simple and does not provide numerical correspondence with experimental fatigue test data, it can explain the existence of a fatigue limit and can be used as a nonlinear regression model of S-N fatigue curve when taking into account the

existence of a random fatigue limit. By using of this model fatigue curve (and especially, fatigue limit) changes as a consequence of tensile strength parameter changes may be predicted. A numerical example of carbon-fiber fatigue test dataset processing is provided.

**Keywords:** fibers, strength, fatigue, Daniels' sequence, Markov chains.

## 1. Introduction

Each year the use of fiber reinforced material (FRM) in aircraft and other technical structures increases. In order to provide reliability of flight the fatigue phenomenon in this material should be studied. Some research on this topic may already be found (Harris 2003). One of the main quantitative characteristics of this phenomenon is a fatigue curve. Various sources provide their own definition of this concept. One frequently used example is the equation suggested by Weibull:  $S - S_{-1} = C(N + B)^{-\alpha}$ , where  $S_{-1}$ ,  $C$ ,  $B$ , and  $\alpha$  are some parameters,  $S$  is the stress amplitude and  $N$  is the corresponding average number of cycles. A deep discussion of the considered problem is presented in (Pascual, Meeker 1999). In table 2 of this paper the seven models for estimates of the fatigue curve quantile are given. However, the parameters of these models have no connections with the parameters of the tensile strength distribution of composite material components.

This paper is a review integrating, amending and developing the approach applied in previous works of authors (Paramonov *et al.* 2006, 2010, 2011, 2012b, c; Cimanis, Paramonov 2012), which are devoted to the connection of tensile strength distribution parameters and parameters of fatigue curve, S-N, for unidirectional fibre composite using the model, based on the Markov chain (MCh) theory. In (Cimanis, Paramonov 2012; Paramonov *et al.* 2012b, c) the MCh state space is defined by Daniels' sequence, the definition of which was introduced initially in (Paramonov *et al.* 2006). It is also connected with the cumulative distribution function (cdf) of strength of longitudinal items (LI) (fiber or strands) of unidirectional FRM. Here, the estimate of cdf based on the random sample will be used instead of cdf itself, and the definition of random Daniels' sequence (RDS) is introduced. The "likelihood" of theoretical and experimental fatigue curves may be considered as proof of the model offered in this paper. A numerical example of carbon-fiber fatigue test dataset processing is provided. The paper is an expansion of ideas on the problems considered in book (Paramonov *et al.* 2011).

The statistical description of the strength of bundles of threads was theoretically described in the papers (Daniels 1945, 1989; Phoenix, Taylor 1973; Smith 1982; Phoenix *et al.* 1997). Application of the Markov chains (MCh) theory to the analysis of fatigue phenomenon is thoroughly discussed in (Bogdanoff, Kozin 1989; Goda *et al.* 2006). The result of processing fatigue test dataset

using models of fatigue curve with random fatigue limit is presented in paper (Pascual, Meeker 1999).

The model for connection of cdf of tensile strength, fatigue life, residual strength and residual fatigue life (after some preliminary fatigue loading) with the cdf of tensile strength of a composite material component is relatively new. First steps in that direction were made in (Kleinhofs 1983).

In the present article we discuss the probability model of one week micro volumes (WMV) for description of fatigue progress using the definition of the random Daniels' sequence (RDS) and simple Markov chains (MCh), followed by a numerical example of carbon-fiber fatigue test dataset processing.

## 2. Model of WMV of unidirectional FRM.

### The definition of a random Daniels' sequence

The composite specimen for the test of fatigue life can be regarded as a series of parallel systems (Gucer *et al.* 1962) every link of which (parallel system) is some WMV, in which gradual accumulation of fatigue damage takes place. After failure of any of these WMVs, the failure of the specimen also takes place. Here we mainly consider the failure of one WMV. This is a special case and the kernel of the whole problem. The use of the considered model of WMV for the analysis of fatigue problem of the specimen as a whole is considered in (Paramonov *et al.* 2011, 2012a).

First, we assume that the WMV consists of  $n_C$  LIs in parallel with the applied load shared equally among surviving elements. The value of  $n_C$  is assumed to be equal to some constant (it is not a random variable). If the sorted strengths of the individual LIs are denoted by  $X_{(1)}, X_{(2)}, \dots, X_{(n_C)}$ , the strength of the WMV,  $Y$ , is provided according to  $Y = \max \{X_{(k)}(n_C - k + 1) / n_C : 1 \leq k \leq n_C\}$ . The distribution of  $Y$  was investigated by H. E. Daniels (Daniels 1945; Phoenix, Taylor 1973) under the assumption that the fibre strengths,  $X_1, X_2, \dots, X_{n_C}$ , are independent random variables with a known common distribution function. R. L. Smith obtains limit theorems as  $n_C \rightarrow \infty$ ,  $n_L \rightarrow \infty$  simultaneously in consideration of probabilities of large deviations in Daniels' model and improved approximations which lead to significant reductions in error (Smith 1982). If  $x_{1:n_C} = (x_1, \dots, x_{n_C})$  is a sample, i.e. a vector of observations of strength of  $n_C$  LIs of some WMV,  $X_1, X_2, \dots, X_{n_C}$ , then while 'developing' the Daniels' model in time, we obtain the following

sequence, which we refer to as the random Daniels' sequence (RDS),  $\{s_0, s_1, s_2, \dots\}$ :

$$s_{i+1} = s / (1 - \hat{F}_X(s_i)), \quad i = 0, 1, 2, \dots, n_C, \quad (1)$$

where  $s_0 = s$ ,  $s$  is the initial nominal stress (initial load of one LI),  $\hat{F}_X(\cdot)$  is the estimate of cdf of strength of a LI, which is defined by sample  $x_{1:n_C}$ . In what follows, for definiteness, it is assumed that  $s$  is the maximum (nominal) stress of the cycle; items of RDS,  $\{s_0, s_1, s_2, \dots\}$ , are local stresses in a cross section in which some part of LI is destroyed. The following definition of cdf may be used:  $\hat{F}_X(x) = k(x) / n_C$ , where  $k(x)$  is the number of observations which are lower than or equal to  $x$ , but here we use the estimate of cdf developed on the base of maximum likelihood estimates of unknown parameters obtained using sample  $x_{1:n_C}$ . The RDS has the following specific features:

- 1) inequality  $\hat{F}_X(x) \leq 1$  means that  $s_{i+1} \geq s_i$ ;
- 2) if there is the solution of equation

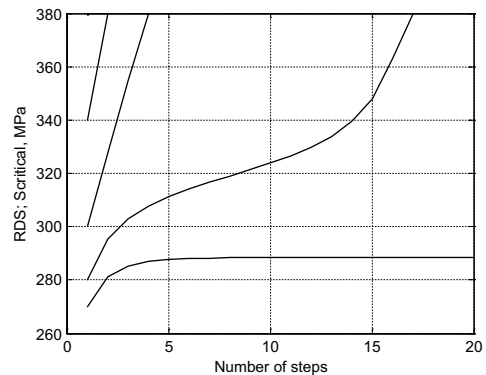
$$s = x(1 - \hat{F}_X(x)), \quad (2)$$

then there is some  $i^*$ , such that  $s_{i^*+1} = s_{i^*}$  and the process of increasing  $s_i$  halts. The maximum value of  $s$  which results in the phenomenon is referred to as RDS-fatigue-limit (RDSFLm). The solution of the equation (2) exists if  $s \leq \max x(1 - \hat{F}_X(x))$ . So, for specific  $x_{1:n_C}$  the specific RDSFLm is equal to  $\max x(1 - \hat{F}_X(x))$ . But this value is equal to the value of Daniels' tensile strength of bundle of LI. Real fatigue-limit is much lower than the ultimate strength of FRM (USFRM). The decrease of the fatigue limit in comparison with the USFRM may be explained in two ways. Firstly, it may be considered to be the result of some additional stress concentration taking place during repeated load cycles. It may also be maintained that the "local tensile fatigue strength" of LI is lower than the one of single LI. Examples of data processing the fatigue test of carbon-fiber composite using the assumption about development of additional stress concentration for the case  $n_C \rightarrow \infty$  and  $\hat{F}_X(x) = F_X(x)$  are illustrated in (Cimanis, Paramonov 2012; Paramonov *et al.* 2012b, c). Here we assume that  $n_C$  is limited and that the final "local fatigue tensile" strength decreasing in  $k_f$  time takes place:  $X_L = X / k_f$ . In the following we use  $F_{X_L}(\cdot)$  instead of  $F_X(\cdot)$  and define the RDSFLm by equation  $S_D = \max x(1 - \hat{F}_{X_L}(x))$ . In fact, these two approaches are "convertible" but it appears that the terminology is easier in this case.

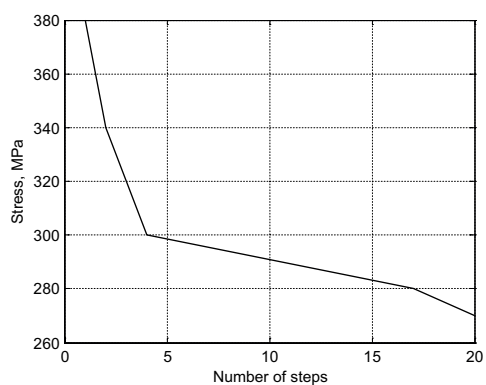
If stress  $s$  is more than RDSFLm then items of RDS grow up to infinity. Growth of stress corresponds to the decrease of local specimen cross section area. Let us define that the failure of specimen takes place if local cross section area becomes less than  $f_C$  (a critical part

of still intact LI; initial cross section area is equal to one) of some value. Then critical stress corresponding to this event,  $s_{UT}^*$ , is defined from equation  $f_C = 1 - F_{X_L}(s_{UT}^*)$ :  $s_{UT}^* = F_{X_L}^{-1}(1 - f_C)$ . The number  $N_D = \max\{i : s_i < s_{UT}^*\}$  is referred to as Daniels' fatigue life (RDSFLf) at stress  $s$ . Therefore, there are two different types of RDS: 1) RDS is directed upwards to infinity if level of cycling stress  $s$  is greater than RDSFLm, in which case RDSFLf is limited; 2) after a slight increase RDS is directed to infinity in a horizontal direction if  $s$  is smaller than RDSFLm; in this case RDSFLf is equal to infinity. Examples of processing of fatigue test dataset in which there are right-censored fatigue observations are shown in figures 1 and 2. The dataset employed in this analysis was kindly given to the authors by W. Q. Meeker, who already studied them (Pascual, Meeker 1999) and provides the following description of the data: "the data come from 125 specimens analysed in four-point out-of-plane bending tests of carbon eight-harness-satin/epoxy laminate. Both fiber fracture and final specimen fracture occurred simultaneously. Thus, fatigue life is defined as the number of cycles until specimen fracture. The dataset includes 10 right-censored observations (referred to as "runouts" in the fatigue literature)".

The RDSs for different stress levels:  $s = 340, 300, 280$ , and  $270$  MPa are shown in figure 1a (RDS for  $s = 380$  is not shown because it is too short).



(a)



(b)

Fig. 1. Examples of (a) RDS, and (b) fatigue curve  $S-N_D$

Nevertheless, there are some reservations. If  $N_D = \infty$  then in the figure the “censored” value  $N_{DC} = 20$  is shown because  $\infty$  cannot be shown. Therefore, the output is  $N_{DC} = \min(N_D, 20)$ .

It is evident that employment of an RDS definition allows to explain the existence of a fatigue limit: for  $s = 270$  MPa the  $N_D = \infty$ . But the value of  $N_D$  is very small if  $s$  is not very close to the RDSFLm. Therefore, in order to meet the real fatigue life value the value of  $N_D$  must be “stretched out”. This may be achieved by using  $k_D N_D$ ,  $k_D \geq 1$ , instead of  $N_D$ . Two other approaches are offered in (Paramonov et al. 2011, 2012b, c; Cimanis, Paramonov 2012). In Paramonov et al. (2011, 2012b), Cimanis and Paramonov (2012) the MCh model was used. Evidently, accumulation of some energy and corresponding number of cycles are needed to cause failure of LIs even if their local strength already is lower than stress. Therefore, in (Paramonov et al. 2012b) the  $N_D$  was connected with the time needed for accumulation of some energy, which is a part of energy necessary for failure of specimen at a tensile test. It is not clear which approach is better and a special investigation is needed to provide an answer.

In this analysis the first approach and Monte Carlo modelling of sequence  $\{s_0, s_1, \dots\}$  was used. In this case the description of a random process of accumulation of fatigue damage is defined by:

- (1) initial (maximum cycle) stress,  $s$ ;
- (2) cdf of strength of LIs,  $F_{X_L}(\cdot)$ , taking into account the decrease of local stress by  $k_f$  time;
- (3) sample size,  $n_C$ ;
- (4) method of estimation of  $F_{X_L}(\cdot)$  using sample,  $x_{L,1:n_C}$ .

The description of a specific realization of this process begins with the recording of a specific sample,  $x_{L,1:n_C}$ , and with the definition of RDS type. For two different types of RDS we consider MChs with two types of absorbing states (see two following sections). In both cases the state space of MCh is connected with items of RDS. In this paper we consider a simple MCh, in which the transition can be made only in the next senior state. A more complex two dimensional MCh (when the influence of composite matrix is taken into account) is considered in (Paramonov et al. 2011, 2006), however, for the state space of MCh matrix, which is not connected with the RDS. The main object in this paper is the employment of the RDS for explanation of existence of random RDSFLm and for analysis of fatigue RDSFLf processing result of a specific fatigue test (see numerical example).

### 3. Simple MCh model of first type

First of all we are interested in the cases when RDSFLf is final. Let us denote the pair {nominal stress,  $s$ ; the sample,  $x_{L,1:n_C}$ } with which this event takes place by

$\{s, x_{L,1:n_C}\}^*$  and corresponding RDS by  $\{s_0, s_1, \dots, s_{r-1}\}^*$ . We regard the MCh as conditional as long as the RDS of this type takes place and the first  $r$  states of corresponding MCh are related with items of Daniels’ sequence,  $\{s_0, s_1, \dots, s_{r-1}\}^*$ ;  $(r+1)$ -th is the absorbing state.  $S_r$ , corresponding to the situation when the RDS-item becomes greater than  $s_{UT}^*$ . We assume for simplicity, that only the transitions to the nearest ‘senior’ states can take place. The following matrix illustrates transition probabilities:

$$P = \begin{bmatrix} q_1 & p_1 & 0 & \dots & 0 \\ 0 & q_2 & p_2 & 0 & \dots & 0 \\ 0 & 0 & q_3 & p_3 & 0 & \dots & 0 \\ \dots & \dots & \dots & \dots & \dots & \dots & \dots \\ 0 & \dots & 0 & q_r & p_r \\ 0 & \dots & 0 & 0 & 1 \end{bmatrix}, \quad q_i = 1 - p_i, \quad i = 1, \dots, r.$$

The main characteristics of this type of Markov chain are well known: time until absorption  $T_A = X_1 + X_2 + \dots + X_r$ , where  $X_i$  (time the process spends in  $i$ -th state) and  $i = 1, \dots, r$ , are independent random variables which have a geometric distribution with probability mass function  $P(X_i = n) = (1 - p_i)^{n-1} p_i$ ,  $i = 1, 2, \dots$ . Expectation value and variance are equal to  $E(X_i) = 1/p_i$  and  $V(X_i) = (1 - p_i)/p_i^2$ .

Probability generating function for random variable  $T_A$  is equal to  $G_T(z) = \sum_{i=1}^r p_i z^i = \prod_{i=1}^r \frac{z p_i}{1 - z(1 - p_i)}$ ,

the cdf is equal to  $\pi P^t b$ , where  $\pi$  is a row vector of a priori probabilities (in the simplest case  $\pi$  is a row vector of the type  $(1, 0, \dots, 0)$ ) and vector column  $b$  is vector of the type  $(0, \dots, 0, 1)$ . The new steps which we offer are: 1) the connection of transition probabilities with tensile strength distribution parameter and parameters of cycles of fatigue loading, and 2) the connection of MCh state space with RDS. Let us denote by  $\theta$  the vector parameter, the components of which include the parameters of the distribution functions of local strength  $F_{X_L}(\cdot)$ , and some other parameters of the model ( $f_C, k_f, n_C, \dots$ ). Matrix  $P$  and cdf of  $T_A$  are functions of parameter  $\theta$  and the pair  $\{s, x_{L,1:n_C}\}^*$ :

$$F_{T_A}(t; \theta, \{s, x_{L,1:n_C}\}^*) = \pi P^t b, \quad t = 1, 2, 3, \dots \quad (3)$$

It is assumed that one step of Markov chain case corresponds to  $k_M$  cycles in general ( $k_M$  is also a component of vector  $\theta$ ). Then the fatigue life (the fatigue cycle number up to specimen failure)  $T$  is equal to  $k_m T_A$ . The  $p$ -quantile fatigue curve, which defines the fatigue life  $t_p(s)$  (the number of cycles corresponding to the probability of failure  $p$  under a nominal stress  $s$ ), and the corresponding mean fatigue curve are defined by equations:

$$t_p(s) = k_m F_{T_A}^{-1}(p; \theta; (s, x_{L,1:n_C})^*);$$

$$E(T(s)) = \int_0^\infty t dF_{T_A}(t; s, \theta; x_{L,1:n_C}^*). \quad (4)$$

It should be reminded that the sample  $x_{L,1:n_C}$  is random. So the matrix  $P$ , and cdf of  $T_A$  are also random. A row vector  $\pi$  of a priori probabilities and vector column  $b$  of the type  $(0, \dots, 0, 1)'$  are also random because their length is defined by random RDS  $\{s_0, s_1, \dots, s_{r-1}, s_r\}^*$ . Therefore, it is necessary to calculate the mean values or to find the corresponding quantiles (at specific argument  $s$ ) of these functions under the condition that the pair  $\{s, x_{L,1:n_C}\}^*$  takes place. Calculation of the corresponding integrals takes up a lot of time, so it is more convenient to use the Monte Carlo (MC) method. First, a sample  $x_{L,1:n_C}$  must be obtained. Then for every specific  $s$  (the point of S-N curve) the RDS should be calculated and if it is a first type RDS, functions  $F_{T_A}(\cdot)$ ,  $t_p(\cdot)$  and  $E(T(s))$  for this specific stress level,  $s$ , should be calculated. Modelling of samples should be repeated long enough to reach the necessary precision. The value of part of the MC trials which provide the pairs of the first type,  $\{s, x_{L,1:n_C}\}^*$ , is an estimate of the probability that Daniels fatigue limit is lower than stress level  $s$ . Calculation for different  $s$  gives the estimate of cdf of random Daniels' fatigue limit.

**4. Simple Markov chain model of second type**

The second type of the MCh corresponds to the situation when stress  $s$  is smaller than RDSFLm and RDSFLf is equal to infinity. This case corresponds to the existence of the solution of equation (2). Assuming that  $i^* = \min(i : s_{i+1} = s; i = 0, 1, 2, \dots)$ , the states of MCh are connected with the first  $i^*$  items of RDS:  $s_0, s_1, s_2, \dots, s_{i^*}$ . The last state is the absorbing one. All previous equations for the number of steps of MCh to absorption can be used again but they are not of great interest for the definition of fatigue life, which is in this case infinite. This type of matrix may be useful for calculation of cdf of fatigue life under program fatigue loading, if the loads are included in the program that the fatigue life is limited. Here we do not consider the analysis of fatigue life under program loading. This problem in relation to different types of state space of MCh is considered in (Paramonov *et al.* 2011, 2006).

It must be noted once more that all equations related to the calculation of cdf of fatigue life using the MCh of first type are conditional: under the condition that stress  $s$  is greater than RDSFLm. Hence, the main interest is the calculation of the probability of this event. The probability can be calculated using the MC method but an approximate value can be obtained using Daniels' result as well: random variable  $S_D = \max x(1 - \hat{F}_{X_L}(x))$

has an approximately normal distribution with mean value  $\mu_D = \max x(1 - F_{X_L}(x)) = x^*(1 - F_{X_L}(x^*))$  and standard deviation  $\sigma_D = (\mu_D x^* F_{X_L}(x^*) / n_C)^{1/2}$  defined by  $F_{X_L}(\cdot)$  (Daniels 1945, 1989; Smith 1982).

**5. An example of censored data processing using  $k_{fm}$ -RDS\_MCh model**

The studied model will be referred to as  $k_{fm}$ -RDS\_MCh model. For modelling vector  $X_{L,1:n_C} = (X_{L1}, \dots, X_{Ln_C})$  the Weibull distribution was used with cdf being  $F_{X_L}(x) = 1 - \exp(-\exp((\log(x) - \theta_0) / \theta_1))$ , where  $\theta_0 = 5.99$  and  $\theta_1 = 0.1416$ . These parameters correspond to the result of tensile test of carbon fiber strands (Kleinhofs 1983):  $E(\log(X)) = 6.44$ ,  $\sigma(\log(X)) = 0.1816$  (pity, there are no data of tensile test results of specific carbon fibers or strands in (Pascual, Meeker 1999)). The first value was corrected in accordance with  $k_{fm}$ -RDS\_MCh model:  $E(\log(X_L)) = E(\log(X)) - \log(k_f)$ . The local strength decreasing coefficient  $k_f = 1.7$  was found by fitting the considered dataset. It was expected that the fatigue failure of specimen corresponds to the failure of some weak micro volume, which consists of  $n_C = 20$  longitudinal items (it is assumed that after their failure the “domino-effect” takes place (Paramonov *et al.* 2011); but the failure of WMV takes part if its critical part  $f_C = 0.5$  is destroyed. Corresponding critical stress  $s_{UT}^*$  is equal to 379.7. Here and in the following the the MPa is used as stress unit. Time scale factor  $k_m$  (N.B. one step of MCh corresponds to  $k_m$  fatigue loading cycles) is equal to 57.8. This value was also obtained by fitting the test dataset (Pascual, Meeker 1999). It is maintained that, in accordance with Daniels' theory for Weibull distribution of strength of single LI, the parameters of normal distribution of  $S_D$  (for strength of bundle LIs) are:  $\mu_D = \theta_1^{\theta_1} \exp(\theta_0 - \theta_1)$  and  $\sigma_D = \mu_D ((\exp(\theta_1) - 1) / n_C)^{1/2}$ . As for the parameter of cdf  $F_{X_L}(\cdot)$  of local tensile strength mentioned previously  $\mu_D$  is equal to 263.2 and standard deviation  $\sigma_D$  is equal to 22.95. It is very important to know the maximum of stress, which is denoted as  $s_\infty$ , for which RDSFLm is more than this value with high probability  $p_\infty$ . Taking into account the normal distribution of  $S_D$ , the following equation is derived:  $s_\infty = \mu_D - \sigma_D \Phi^{-1}(p_\infty)$ . For  $p_\infty = 0.99$  we have  $s_\infty = 209.8$ . Calculation of random RDSFLm should be made for every pair  $\{s, \text{MC-sample}, (x_{L1}, \dots, x_{Ln_C})\}$  in order to single out the RDS of the first type. In the example considered the calculation was made for every  $s$  in the set  $\{380 \ 340 \ 300 \ 280 \ 270\}$  and the estimate of cdf of the random RDSFLf and mean conditional fatigue curve  $S - N_M$  were obtained. This is illustrated in figure 2. The dataset of fatigue test result (Pascual, Meeker 1999) is also shown.

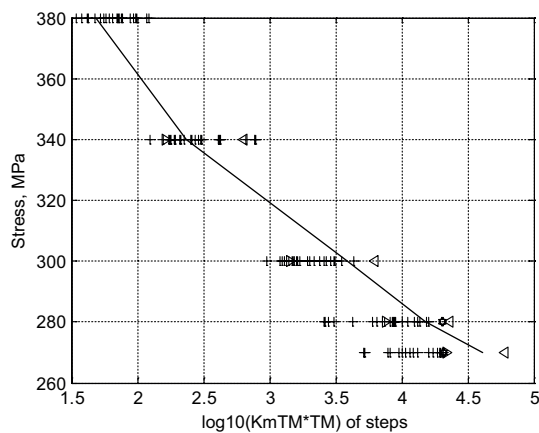


Fig. 2. Mean model fatigue curve (-), two standard deviation intervals (▶, ◀) for 15 MC trials and test data (+); the censored data are noted by \*

As mentioned, the processing of the same data was performed in (Pascual, Meeker 1999) using the random fatigue-limit model (RFLM). It must be noted that the random fatigue limit model offered is described in the following way: “ $Y$  is the fatigue life and  $s$  is the stress level. We model  $Y$  as  $\log(Y) = \beta_0 + \beta_1 \log(S - \gamma) + \varepsilon$ , where  $\beta_0$  and  $\beta_1$  are fatigue curve coefficients,  $\gamma$  – is the fatigue limit of the specimen,  $\varepsilon$  is the error term, and  $\log$  denotes a natural logarithm. Let  $V = \log(\gamma)$ , and supposing that  $V$  has a probability density function (pdf)  $f_V(v; \mu_\gamma, \sigma_\gamma) = \phi_V((v - \mu_\gamma) / \sigma_\gamma) / \sigma_\gamma$  with location and scale parameters  $\mu_\gamma$  and  $\sigma_\gamma$ , respectively,  $\phi_V(\cdot)$  is either the standardised smallest extreme value (sev) or normal pdf. Let  $X = \log(s)$  and  $W = \log(y)$ . Assuming that, conditioned on a fixed value of  $V < x$ ,  $W|V$  has a pdf  $f_{W|V}(w; \beta_0, \beta_1, \sigma, x, v) = (1/\sigma)\phi_{W|V}((w - a)/\sigma)$  with location parameter  $a = \beta_0 + \beta_1 \log(\exp(x) - \exp(v))$  and scale parameter  $\sigma$ .  $\phi_{W|V}(\cdot)$  is either the standardised sev or normal pdf. For both random values:  $V$  and conditional  $W|V$ , the two mentioned pdfs can be used: for all four versions of sets  $\{V, W|V\}$  the fitting of the dataset was performed using the RFLM and ML methods.

The model considered in this paper in some way corresponds to the sev distribution of  $V$  and normal distribution of  $W|V$  (in accordance with Daniels’ proof of asymptotic normal distribution of strength of bundle of fibers). Concerning this case the following estimates are found in (Pascual, Meeker 1999): 5.39 and 0.02 for mean and standard deviation of  $V$ . This corresponds to 219.2 and 133 as estimates of mean and standard deviation of fatigue limit.

In the considered dataset there are 2 and 8 right-censored data for stress levels 280 and 270 correspondingly (25 fatigue tests for every stress level). This corresponds to estimates of the corresponding probabilities by values 0.08 and 0.32. In accordance with an asymp-

totic normal distribution of RDSFLM with mean 263.2 and standard 22.95 deviation (for this dataset the value  $k_f = 1.7$  was accepted after fitting fatigue life), the probability that RDSFLM is higher than stress levels 280 and 270 is equal to 0.232 and 0.383 correspondingly. The same probability calculated by the MC method is estimated to correspond to values 0.133 and 0.400.

## 6. Conclusion

The phenomenon of RDS allows to explain the existence of a fatigue limit. The reasonable fitting of fatigue test data of carbon-fiber composite specimen is obtained using a simple Markov chain model with states of space based on random Daniels’ sequence assuming the decrease of local tensile strength of LIs in comparison with tensile strength of single LI and some time scale factor. The basic specific feature of models of this type is the possibility of **establishing a relation between the parameters of distribution of fatigue life and fatigue limit of a specimen and the parameters of tensile strength of its components**. Although the model is too simple and does not provide precise numerical coincidence with experimental fatigue test data, **it explains the existence of a fatigue limit** and can be used as a nonlinear regression model of an S-N fatigue curve. By using this model, fatigue curve changes as a consequence of tensile strength distribution parameter changes may be predicted.

The great number of unknown parameters of the regression model prevents us (until a successful solution of the problem of creating an effective parameter search algorithm will be found) from recommending it for practical use. However, this model undoubtedly deserves a more extensive and careful verification and has a wider application than only as a source for training courses in higher education institutions.

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