

Reliability of Repairable Valves: Analysis of Failure Times from Chemical Plants

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ABSTRACT

The non-homogeneous Poisson process (NHPP) is widely adopted to monitor reliability improvement during system development as well as to model the number of failures for complex systems. The most popular functional forms proposed in the literature to model NHPP intensity functions are monotonic with time. However, there are situations in which the use of monotonic intensity functions can be too restrictive. In this paper, a new Non-Homogeneous Poisson Process with a non-monotonic intensity function is presented. The model is tested to formulate the reliability of repairable valves that are used for critical functions in a chemical plant. The analysis is performed by adopting a real set of time data that were collected during the first operative years of the plant. In general, similar applicative cases arise when a model is needed for the reliability of a complex system/plant in the early phase of the operative life. The model fits well all the analysed failure data sets, each corresponding to a specific type of valve.

Keywords: Failure mechanism; Intensity function; Model identification; Non Homogeneous Poisson Process; Cramèr-Von Mises Goodness-Of-Fit Test.

I. INTRODUCTION

As is known, the NHPP furnishes a good description of repairable systems subject to *minimal repairs* (i.e., the part repaired or substituted has a negligible effect on the system reliability) or systems experiencing reliability improvement (Duane, 1964; Crow, 1974). Among the NHPPs, the power law process (PLP) (Cox and Lewis, 1966; Crow, 1974) is very popular to model the reliability growth of repairable systems, which are either deteriorating or improving with the operating time (i.e., the intensity is monotonic with the operating time). However, it cannot be appropriately used when a non-monotonic trend in the number of failures is observed (e.g., early phase of new system's operative life).

In particular, in Section 2, it is found unsuitable for modelling a real dataset of failure records of mechanical valves used for critical functions that has been collected during the first operative years of a chemical plant. In Section 3, a new Non-Homogeneous Poisson Process with a non-monotonic intensity function is presented. In Section 4, the parameters of the presented model are estimated and the model is tested to formulate the reliability of the repairable valves considered in Section 2. In Section 5 concluding remarks are drawn in order to set up future directions of similar research.

II. PRELIMINARY RELIABILITY ANALYSIS

In order to attain economy of scale, many chemical plants are planned and built to be very large. Consequently, they involve very complex control systems with several thousands of components. Among these, a large number of mechanical valves have critical missions and give rise to a relevant reliability modelling problem (Soleimani et al., 2014). Valves are not standardised because their mission includes many functions—like flow control, flow arrest and pressure relief—as well as a wide range of working conditions. This variety of shape and size prevents one from observing large samples of duplicate valves in similar operating conditions. The valve data analysed in this paper are from a data collection activity carried out during the first operative years of a chemical plant. The dataset covers many different types, manufacturers, sizes and media as well as a wide range of operational pressure and temperature. The several factors that affect the failure rate may be difficult to establish as remarked also by Bhattacharjee et al. (2003) in a similar study on nuclear power plant failure data. The valves consist of a pneumatically operated ram, that displaces fluid from the interior, and prevents the subsequent blockage due to solidification of the fluid itself. The available dataset includes records of the four factors (Table 1) that are utilized to group by the

valves.

Table 1. Valve groups

| Diameter <i>d</i> inches | Medium | Temperature °C | Pressure |
|-----------------------------|----------------|-------------------|-------------|
| (4-12) | steam or water | (130-351) | high or low |

From a reliability point of view, the diameter is to be the most significant factor, since, in general, valves of unequal diameter are situated in different area/subsystems and thus encounter different environments, duties and applications. For example, all 7" diameter valves are mainly situated on low-pressure steam lines, whereas 5" valves are on bypass or drain lines with high pressure and water as medium. Then, in the following, each group will be identified by the diameter size *d* (in inches) of their valves. Failure time data are reported in Table 2 for each of the five groups considered in Table 1. The observation period has been stopped after 1307 days ($t = t_c$). However, valve groups did not start to operate simultaneously, then a starting time delay (t_0) has to be considered for each group. For all the valves contained in each group, the data set records

the chronologically ordered numbers of days (*t*) taken from the beginning of the observation period ($t = 0$) to the times when the interested valve shows its failure. Then, for each valve the actual running time is defined as the difference between the calendar time and the time delay t_0 of the corresponding group. For the managerial purposes of the plant, each group of valves is considered a unique repairable system. So, each valve failure is assumed to produce a failure of the group. Moreover, only a negligible proportion of valves (with respect to the number of valves operating in the whole system) is replaced as soon as a failure occurs. Then, minimal repair policy can be also assumed (Maghsoodloo and Helvaci, 2014). A first study is carried out to assess whether the valve deterioration times come from a Homogeneous Poisson Process (HPP).

Table 2. Analysed groups of valves

| Group <i>d</i> | Time delay t_0 | Medium | Temperature °C | Pressure | Total failures <i>n</i> // Total valves <i>m</i> | Laplace's statistic u_L | <i>p</i> -value |
|-------------------|---------------------|--------|-------------------|----------|---|------------------------------|-----------------|
| 4 | 63 | steam | 347 | high | 29//8 | -1.63 | 0.05 |
| 5 | 161 | water | 130 | high | 11//16 | -1.67 | 0.05 |
| 7 | 0 | steam | 351 | low | 22//24 | -1.53 | 0.06 |
| 9 | 0 | steam | 347 | high | 20//20 | -1.77 | 0.04 |
| 12 | 133 | steam | 351 | low | 9//26 | -1.45 | 0.07 |

Under the hypothesis of HPP, the time intervals between successive failures are independent and identically distributed Exponential random variables and the Laplace's statistic u_L rapidly approaches the standardised Normal deviate as the sample size increases (Hascher and Feingold, 1984; Ansell and Philips, 1994):

$$u_L = \frac{\frac{1}{n} \sum_{i=1}^n t_i - \frac{t_c - t_0}{2}}{(t_c - t_0) \sqrt{\frac{1}{12n}}} \quad (1)$$

where t_i is the actual running time to the *i*-th failure.

The values of the statistic u_L , reported in Table 2, are significantly negative in all cases; that gives the evidence for rejecting an intensity function constant with the time. In addition, the

Cramér-von Mises goodness-of-fit test to a PLP (Park and Kim, 1992) is also applied.

The Cramér-von Mises statistic is:

$$C_n^2 = \frac{1}{12n} + \sum_{i=1}^n \left[\left[\frac{t_i}{t_c - t_0} \right]^{\hat{\beta}} - \frac{2i-1}{2n} \right]^2 \quad (2)$$

where $\hat{\beta}$ is the time-censored unbiased maximum likelihood estimate (MLE) of the shape parameter (Crow, 1990; Tobias and Trindade, 2012):

$$\hat{\beta} = \frac{n-1}{\sum_{i=1}^n \ln(t_c/t_i)} \quad (3)$$

The results reported in Table 4 show that the hypothesis of PLP could be rejected in three cases out of five, in spite of the high flexibility and the extensive practical use of this model.

Table 3. Days $t_i + t_0$ from the beginning of the observation period until the i -th failure

| i | Group d | | | | |
|-----|-----------|------|------|------|------|
| | 4 | 5 | 7 | 9 | 12 |
| 1 | 147 | 168 | 42 | 13 | 137 |
| 2 | 150 | 222 | 50 | 17 | 158 |
| 3 | 295 | 264 | 70 | 21 | 246 |
| 4 | 355 | 477 | 122 | 21 | 373 |
| 5 | 418 | 583 | 256 | 101 | 382 |
| 6 | 424 | 585 | 258 | 294 | 664 |
| 7 | 436 | 695 | 297 | 331 | 791 |
| 8 | 438 | 698 | 329 | 387 | 991 |
| 9 | 441 | 712 | 333 | 462 | 1260 |
| 10 | 470 | 798 | 369 | 597 | |
| 11 | 470 | 1045 | 387 | 602 | |
| 12 | 471 | | 388 | 605 | |
| 13 | 471 | | 424 | 633 | |
| 14 | 492 | | 557 | 730 | |
| 15 | 494 | | 617 | 761 | |
| 16 | 498 | | 654 | 763 | |
| 17 | 579 | | 662 | 778 | |
| 18 | 707 | | 798 | 813 | |
| 19 | 709 | | 1243 | 990 | |
| 20 | 709 | | 1266 | 1156 | |
| 21 | 715 | | 1266 | | |
| 22 | 728 | | 1276 | | |
| 23 | 762 | | | | |
| 24 | 762 | | | | |
| 25 | 762 | | | | |
| 26 | 798 | | | | |
| 27 | 814 | | | | |
| 28 | 991 | | | | |
| 29 | 1213 | | | | |

III. RELIABILITY MODEL

The lack of fitting of the PLP to all group data is probably due to an upside-down bathtub-shaped intensity function, inspired by the Aivazian (1970) model proposed in a different context. Then the following very flexible s-shaped function is adopted to fit the mean function

$$M(t) = \frac{b [\exp(t^{1/3}) - 1]}{(a + b) [b + a \exp(t^{1/3})]} \quad (4)$$

whose derivative provides the following intensity function:

$$z(t) = \frac{b \exp(-t^{1/3})}{3 t^{2/3} [a + b \exp(-t^{1/3})]^2} \quad (5)$$

This function is infinite as t approaches zero and, apart from a very short initial time interval, shows an upside-down bathtub predominant shape (Figure 1).

IV. DATA ANALYSIS

Using the ratio i / m (between the observed number of failures by the actual running time t_i and the size of the respective group) as the natural estimator of $M(t_i)$ (Hartler, 1985; Nelson, 1998), we obtain points whose fitting by the model(4), via Least Square Method, provides the estimates of the two parameters a and b . The a and b estimates, obtained in this way, are reported in Table 5. The five fitted $M(t)$ models for $d = 4, 5, 7, 9, 12$ and those interpolated for $d = 6, 8, 10, 11$ are reported in Figure 2. The estimated intensity functions(5) are reported in Figure 1.

V. CONCLUSIONS

Many different phenomena, occurring alternatively or concomitantly in real field, make the HPPs or monotonic-intensity NHPPs too restrictive to monitor/assess the reliability growth

programs of complex systems/plants in the early phase of their operative life. A new Non-Homogeneous Poisson Process with a non-monotonic intensity function has been introduced in order to model the failure times of repairable valves that are used for critical functions during the first operative years of a new chemical plant. The graphs derived for different diameters appear to be a good tool for practical applications and for setting

up future research. In particular, the statistical features of the proposed model and alternative parameter estimation procedures should be investigated. Moreover, additional parameters could be introduced in the model in order to achieve even more flexibility (e.g., by substituting the exponent 1/3 with a new parameter and/or by adding a scale parameter).

Table 4. Cramér-von Mises goodness-of-fit test to a PLP

| Group d | Unbiased MLE of β | Test statistic C_n^2 | Critical value | Significance level |
|-----------|-------------------------|------------------------|----------------|--------------------|
| 4 | 0.95 | 0.63 | 0.33 | 0.01 |
| 5 | 0.59 | 0.45 | 0.32 | 0.01 |
| 7 | 0.75 | 0.39 | 0.33 | 0.01 |
| 9 | 0.61 | 0.25 | 0.22 | 0.05 |
| 12 | 0.48 | 0.29 | 0.21 | 0.05 |

Table 5. Least Square estimates (LSE) of the parameters of the proposed NHPP with intensity function(5)

| Group d | LSE of a | LSE of b | Coefficient of determination |
|-----------|------------|------------|------------------------------|
| 4 | 0.235 | 816.7 | 0.987 |
| 5 | 1.258 | 2535.6 | 0.976 |
| 7 | 1.160 | 1599.9 | 0.993 |
| 9 | 0.955 | 2900.4 | 0.975 |
| 12 | 3.313 | 1072.1 | 0.973 |

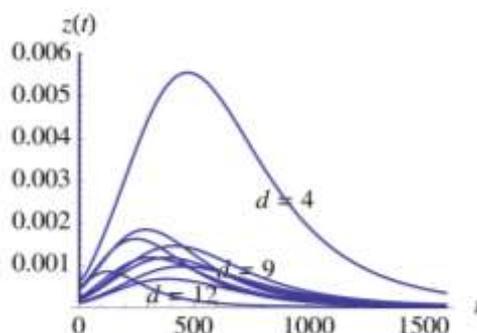


Figure 1. Five intensity functions (5) fitted to data (for valves of diameter $d = 4, 5, 7, 9, 12$) and four intensity functions interpolated (for valves of diameter $d = 6, 8, 10, 11$).

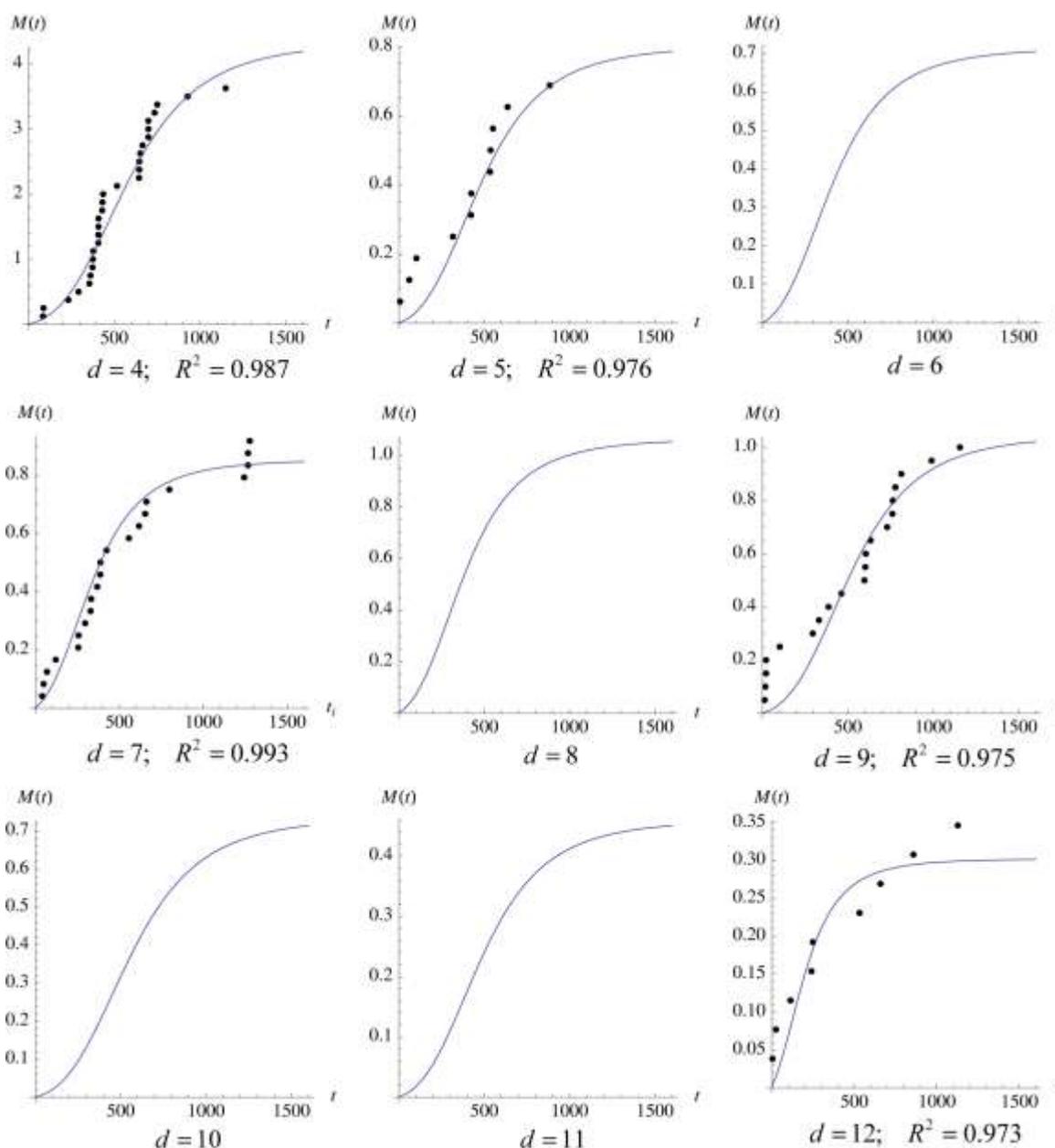


Figure 2. Five mean functions (4) fitted to data (with the corresponding coefficients of determination R^2) and four interpolated mean functions, for valves with respective diameter d .

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