

# Report II

## Periodic inspections and interval censored data

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## Introduction

In this report we will focus on interval censored data. We will consider simple example of lightbulb which is periodically inspected if it has failed.

## Generator

Our implementation of generator is presented on Listing 1. Firstly we create counters for current time, last time of lightbulb checking and last time of lightbulb changing. Also we initialize vectors and list which will store our results. Implementation of event loop is a bit straightforward. We are going through while loop till the current time is smaller than simulation end time. Then we check if lightbulb failed. If yes, then we save intervals, change lightbulb to new one and generate its time of failure and save that time. After that we generate new inspection time. When the while loop ends, we add last observations, which wasn't censored. The function returns list of inspection times, light failure times, censored intervals and initial parameters.

```
# Lambda - failure rate  
# Nu - inspection rate
```

```
generate_censored_data <- function(lambda, nu, time_end) {  
  time_now <- 0  
  lightbulb_next_failure <- rexp(1, rate = 1/lambda)  
  
  inspection_times <- c()  
  light_failures_times <- c(lightbulb_next_failure)  
  intervals <- list()  
  
  lightbulb_last_check <- 0  
  lightbulb_last_change <- 0  
  
  while (time_now < time_end){  
    if (time_now > lightbulb_next_failure){  
      # Save censored interval of failure  
      intervals$left <- c(intervals$left, lightbulb_last_check - lightbulb_last_change)  
      intervals$right <- c(intervals$right, time_now - lightbulb_last_change)  
      intervals$censored <- c(intervals$censored, 1)  
      # Change lightbulb and generate next failure time  
      lightbulb_last_change <- time_now  
      lightbulb_next_failure <- time_now + rexp(1, rate = 1/lambda)  
      # Save real time of future failure  
      light_failures_times <- c(light_failures_times, lightbulb_next_failure)
```

```

    }
    lightbulb_last_check <- time_now
    inspection_times <- c(inspection_times, lightbulb_last_check)
    time_now <- time_now + rexp(1, rate = 1/nu)
  }

  intervals$left <- c(intervals$left, lightbulb_last_check - lightbulb_last_change)
  intervals$right <- c(intervals$right, Inf)
  intervals$censored <- c(intervals$censored, 0)

  return(list(
    inspection_times=inspection_times,
    light_failures_times=light_failures_times,
    intervals=intervals,
    lambda=lambda,
    nu=nu,
    time_end=time_end))
}

```

Listing 1: Implementation of generator.

From theoretical aspect it's worth to mention that process of inspections is a Poisson process because it starts in 0, its increases are independent and its waiting times for next event are independent and have exponential distribution. Besides process of lightbulb changes is not a Poisson process because waiting times are not independent.

Sample realisations of process can be found on figure 1. There are two examples which show times when inspection has occurred (black dots) and lightbulb has died (red dots). As we can observe everything looks correct, especially failures and inspections are in correct order. But to be sure we will make further analysis in next section.

Sample realisations of the process.

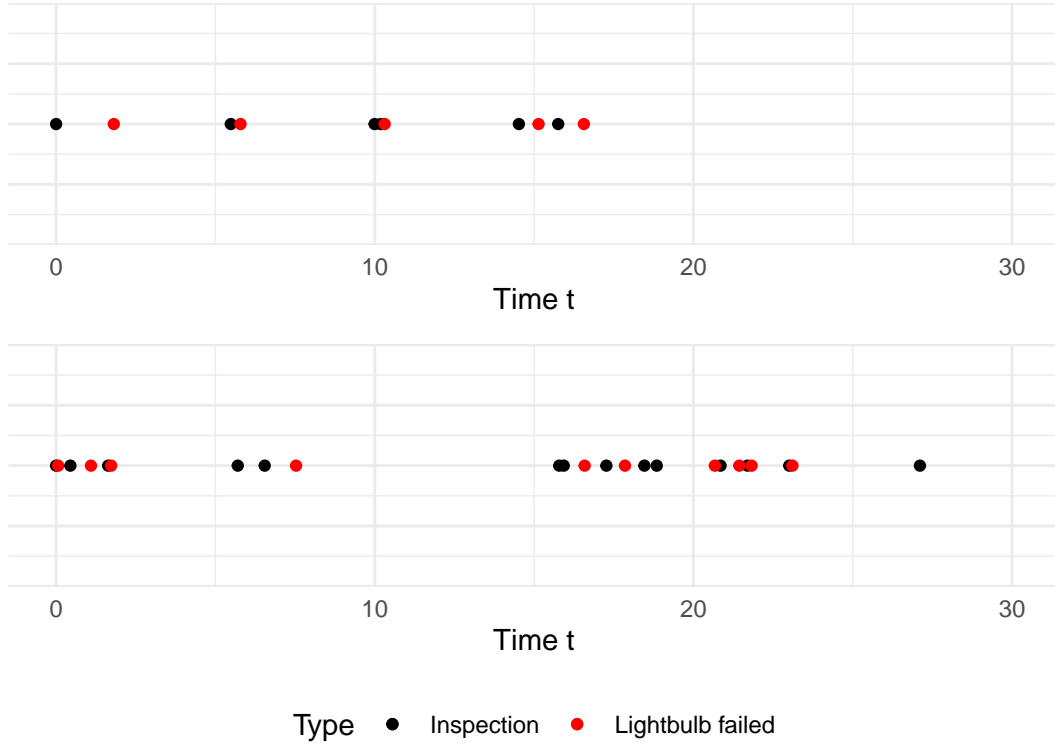


Figure 1: Sample realisation of the process.

## Analysis of generator

Before we start estimations of survival function we will take a closer look to our generator. To do that we have simulated 300 times our process for grid of parameters:

- $\lambda$  -  $[1, 10]$  with step equal 1,
- $\nu$  -  $[1, 10]$  with step equal 1,
- $T_0$  -  $[100, 700]$  with step equal 300.

We want to check following statistics:

- number of lightbulb replacements,
- percentage of time without light,
- number of lightbulb inspections,
- number of lightbulb failures,
- percentage of time when one more inspections occurred before failure.

Our results are presented on plots with following structure:

- x-axis contains  $\lambda$  - lightbulb failure rate,
- y-axis contains value of statistics,

- color represents  $\nu$  - inspection rate,
- grid represents  $T_0$  value.

Figure 2 represents number of lightbulb replacements. Our intuitions is that low rate of  $\nu$  which corresponds to frequent checking of lightbulb will give us the highest value of lightbulb replacements. When we get higher value of this parameter, we will get smaller value of statistic. Also to our minds taking higher value of  $\lambda$  will corresponds to smaller value of replacements because lightbulb will be more durable. As we can see on the plot all our intuitions are similar to obtained results. Also it's worth to mention that parameter  $T_0$  only scales our plot but doesn't affect shape of curves.

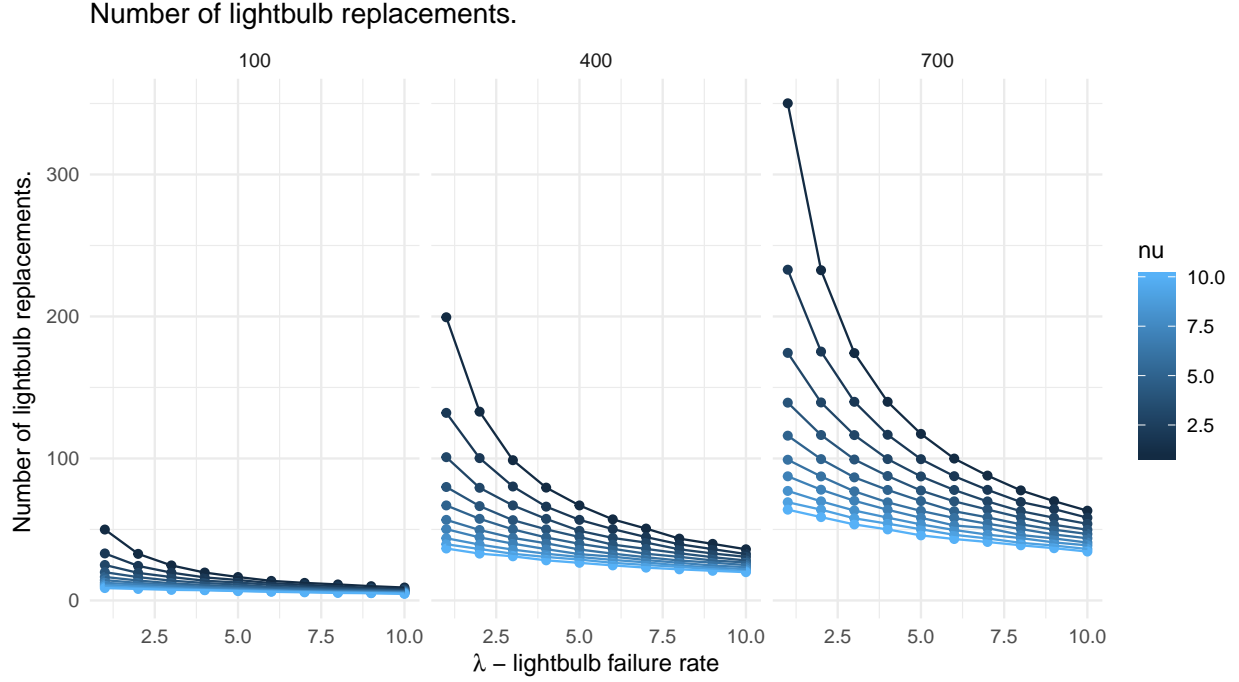


Figure 2: Number of lightbulb replacements in setup of different parameters of process. Color represents value of  $\nu$  - inspection rate.

The second plot, which we will be analysing and can be found on Figure 3, corresponds to statistic ‘percentage of time without light’. It may be very crucial information from application perspective because from this plot we could deduce how often we should check our lightbulb to obtain specific level of percentage of time without light (and going beyond that this answers the question why we care about estimation methods of survival functions and parameter  $\lambda$ ). Our intuitions for that plot is that for high value of  $\lambda$  and small value of  $\nu$  we will get the smallest value of statistic and conversely for small value of  $\lambda$  and high value of  $\nu$  we will get the highest value of statistic. First situation corresponds to very frequent checking of lightbulb which is durable and second one to very rare checking of not durable lightbulb. Our intuitions match to obtained results. Also parameter  $T_0$  has no bigger influence to simulations.

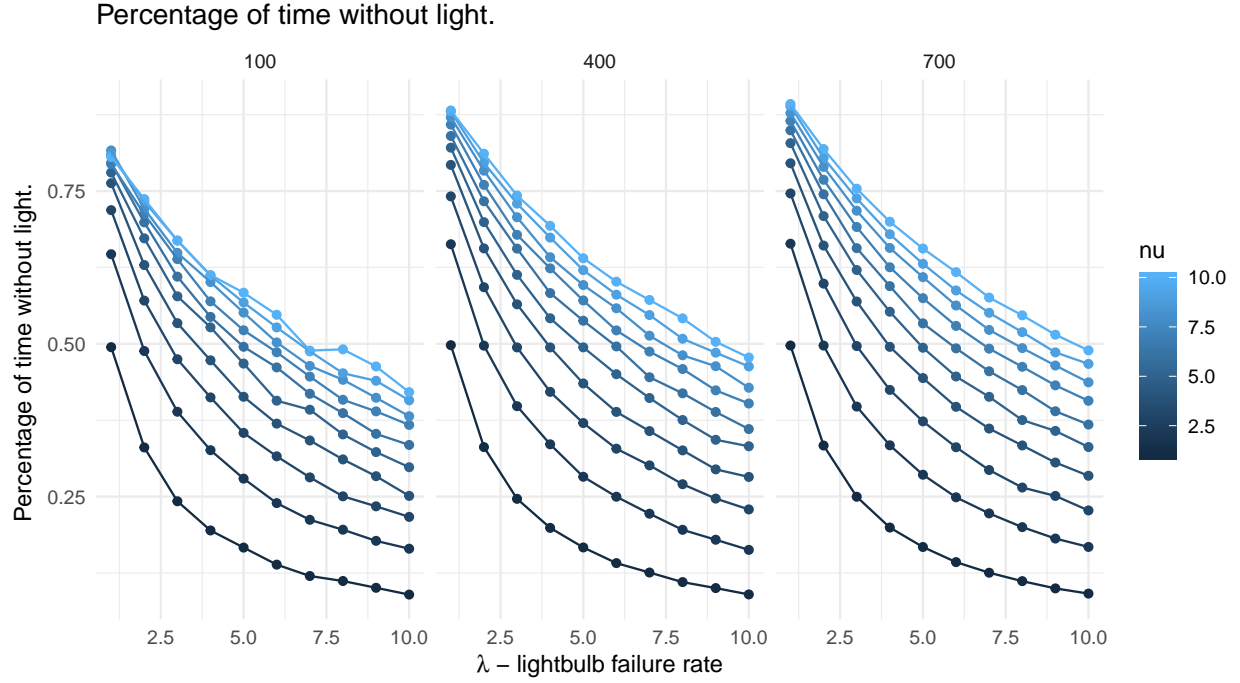


Figure 3: Percentage of time without light in setup of different parameters of process. Color represents value of  $\nu$  - inspection rate.

The next plot represents number of lightbulb inspections and can be found on figure 4. Intuitions for that plot are quite straightforward. Inspections are Poisson process so we should obtain number of lightbulbs equal to  $\frac{T_0}{\nu}$ . Indeed our simulations confirms that and also it can be treated as empirical proof of previous fact. Also it's worth to mention that these statistics doesn't depend on process of lightbulb failures.

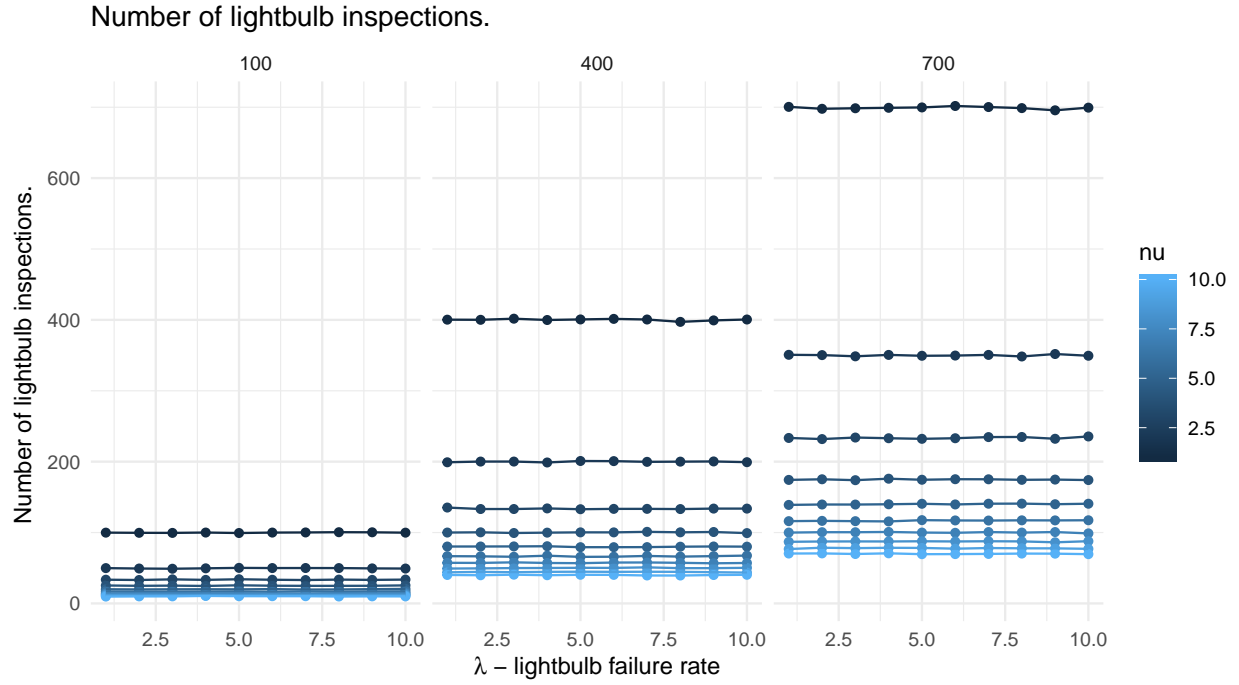


Figure 4: Number of lightbulb inspections in setup of different parameters of process. Color represents value of  $\nu$  - inspection rate.

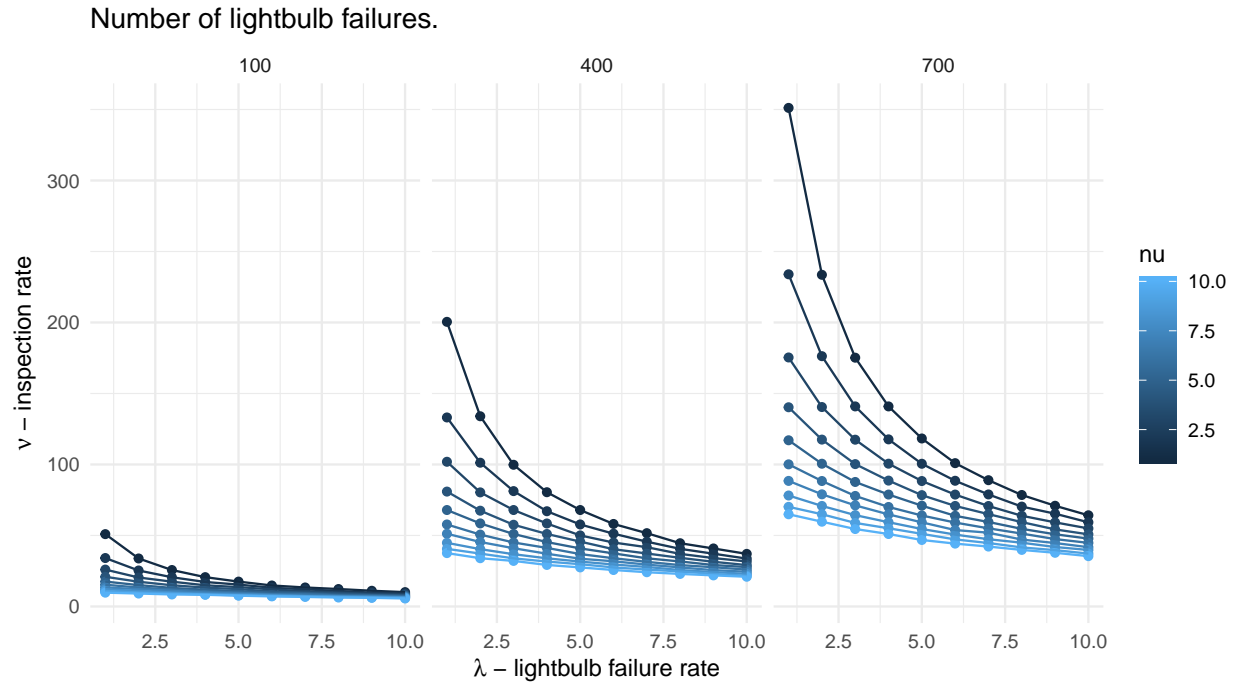


Figure 5: Caption.

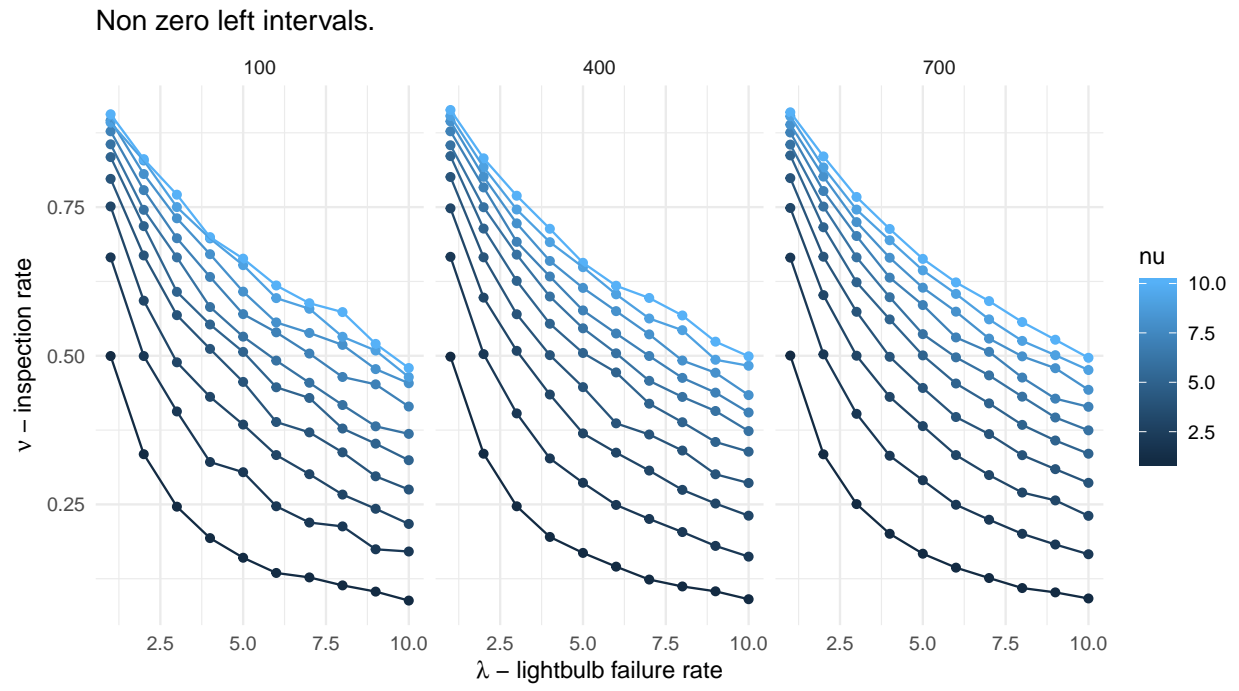


Figure 6: Caption.