## Transformations Application Solutions

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## Exercises

1. 1. Let X be a random variable and let g be a function. By this point, it should be clear that E[g(X)] is not necessarily equal to g(E[X]).

Let  $X \sim \mathsf{Expon}(\lambda = 0.5)$  and  $g(X) = X^2$ . We know that  $\mathsf{E}(X) = \frac{1}{0.5} = 2$  so  $g(\mathsf{E}(X)) = \mathsf{E}(X)^2 = 4$ . Use R to find  $\mathsf{E}[g(X)]$ . Make use of the fact that R has  $\mathsf{rexp}()$  built into it, so you don't have to create your own random variable generator.

Let  $Y = X^2$ .

sims<-rexp(10000,0.5)
mean(sims^2)</pre>

## [1] 8.108825

So, g(E(X)) = 4 and  $E(g(X)) \approx 7.84$ .

2. Let  $X \sim \mathsf{Binom}(n,\pi)$ . What is the pmf for X+3? Make sure you specify the domain of Y. [Note, we have used p for the probability of success in a binomial distribution in past lessons but some references use  $\pi$  instead.]

Let Y = X + 3:

$$f_Y(y) = P(Y = y) = P(X + 3 = y) = P(X = y - 3) = f_X(y - 3) = \binom{n}{y - 3} \pi^{y - 3} (1 - \pi)^{n - y + 3}$$

where  $3 \le Y \le n+3$ .

3. Let  $X \sim \mathsf{Expon}(\lambda)$ . Let  $Y = X^2$ . Find the pdf of Y.

CDF method:

$$F_Y(y) = P(Y \le y) = P(X^2 \le y) = P(X \le \sqrt{y}) = 1 - e^{-\lambda\sqrt{y}}$$

So,

$$f_Y(y) = \frac{\mathrm{d}}{\mathrm{d}y} F_Y(y) = -e^{-\lambda\sqrt{y}} \times \frac{-\lambda}{2\sqrt{y}} = \frac{\lambda e^{-\lambda\sqrt{y}}}{2\sqrt{y}}$$

for y > 0.

PDF method:

$$f_Y(y) = \lambda e^{-\lambda\sqrt{y}} \frac{1}{2\sqrt{y}} = \frac{\lambda e^{-\lambda\sqrt{y}}}{2\sqrt{y}}$$

for y > 0.

4. OPTIONAL: In exercise 3, you found the pdf of  $Y = X^2$  when  $X \sim \mathsf{Expon}(\lambda)$ . Rearrange the pdf to show that  $Y \sim \mathsf{Weibull}$  and find the parameters of that distribution.

$$f_Y(y) = \frac{\lambda e^{-\lambda \sqrt{y}}}{2\sqrt{y}} = \frac{\lambda}{2\sqrt{y}} e^{-\lambda \sqrt{y}} = \frac{\lambda^2}{2} \frac{1}{\lambda \sqrt{y}} e^{-\sqrt{\lambda^2 y}} = \frac{1/2}{1/\lambda^2} \left(\frac{y}{1/\lambda^2}\right)^{\frac{1}{2} - 1} e^{-\left(\frac{y}{1/\lambda^2}\right)^{\frac{1}{2}}}$$

So,  $Y \sim \text{Weibull } (\alpha = \frac{1}{2}, \beta = \frac{1}{\lambda^2}).$ 

5. You are on a team of two. You are both tasked to complete an exercise. The time it takes you  $T_1$ , and likewise, your teammate  $T_2$  to complete the exercise are independent random variables. Exercise completion time, in minutes, is distributed with the following pdf:

$$f_T(t) = \frac{-t}{200} + \frac{3}{20}; 10 \le t \le 30$$

Figure 1 is a plot of the pdf.

## pdf of T

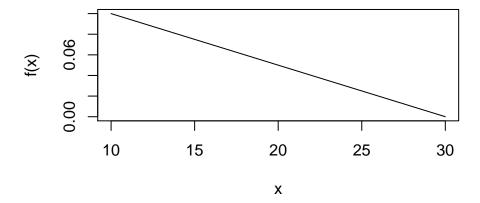


Figure 1: pdf of T

We want to find the probability our combined time is less than 40 minutes,  $P(T_1 + T_2 < 40)$ . We will solve this in steps in this problem. We are going to use a computational method because the mathematics is long and algebra intensive. You are welcome to try a mathematical solution if you like but we will not provide a mathematical solution.

a. Use the integrate() function to confirm this is a valid pdf.

## integrate(function(x)-x/200+3/20,10,30)

## 1 with absolute error < 1.1e-14

b. Find the cdf of T mathematically.

$$\int_{10}^{x} \frac{-t}{200} + \frac{3}{20} dt = \frac{-t^2}{400} + \frac{3t}{20} \Big|_{10}^{x} = \frac{-x^2}{400} + \frac{3x}{20} - \frac{5}{4}$$

c. To use the cdf to simulate random variables from this distribution, we need the inverse of the cdf which means we have to solve a quadratic equation. We can do this mathematically or just use the function uniroot(). So first, we will make sure we understand how to use uniroot().

As a check, we know the median of the distribution is approximately 15.857. Here is code to show that 15.857 is approximately the median. We are integrating the pdf from 10 to 15.857 to confirm that this is 0.5.

```
integrate(function(x)-x/200+3/20,10,15.857)
```

## 0.4999389 with absolute error < 5.6e-15

Use uniroot() and your cdf to confirm that 15.857 is the median.

Solution.

```
uniroot(function(x)-x^2/400+3*x/20-5/4-.5,c(10,30))$root
```

```
## [1] 15.85786
```

d. We will create a function to take a random uniform variable on the interval [0,1] and return a value of our random variable, T, exercise time. We can then use this function to simulate each of the exercise times and then create a new random variable that is the sum. Complete the R code and check that it returns the median.

```
T <- function(y){
  uniroot(function(x)"YOUR CDF HERE as a function of x"-y,c(10,30))$root
}</pre>
```

We made it a function of y since we are using x in our cdf. There are two function calls here, can you see why?

```
T <- function(y){
  uniroot(function(x)-x^2/400+3*x/20-5/4-y,c(10,30))$root
}</pre>
```

```
T(.5)
```

## [1] 15.85786

e. Vectorize the function you just created using the Vectorize() function. Check that it is vectorized by entering c(.5,.75) into the function. You should get 15.85786 20.00000 as an output.

```
T<-Vectorize(T)
```

```
T(c(.5,.75))
```

## [1] 15.85786 20.00000

```
integrate(function(x)-x/200+3/20,10,20)
```

```
## 0.75 with absolute error < 8.3e-15
```

f. We are ready. Let's create a data frame with 10000 simulation for our time and another 10000 for our teammates. Remember to set a seed. At this point it may be hard to remember what we have done. The function we created takes as input a vector of random number from a uniform distribution and then applies the inverse cdf to generate a random sample from our given pdf.

```
T(runif(3))
```

## [1] 14.32964 11.23093 18.19443

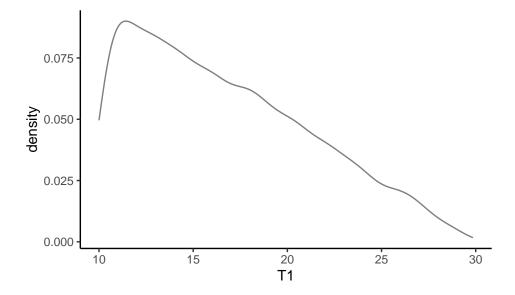
```
set.seed(1144)
sim_exercise <- tibble(T1=T(runif(10000)),T2=T(runif(10000)))</pre>
```

g. Do a numerical summary of the data and plot a density plot of your exercise times to give us confidence that we simulated the process correctly.

```
inspect(sim_exercise)
```

```
##
##
   quantitative variables:
##
               class
        name
                                           median
                                                         Q3
                           min
                                      Q1
                                                                 max
                                                                         mean
          T1 numeric 10.00066 12.69182 15.91884 20.04111 29.85565 16.69611
          T2 numeric 10.00028 12.65653 15.79768 20.03195 29.63950 16.64766
##
              sd
                      n missing
##
   ...1 4.719835 10000
                              0
  ...2 4.716582 10000
                              0
```

```
gf_dens(~T1,data=sim_exercise) %>%
gf_theme(theme_classic())
```



h. Create the new variable that is the sum of the two exercise time and then find the probability that the sum is less than 40.

```
sim_exercise %>%
  mutate(T_sum=T1+T2) %>%
  summarise(prob=mean(T_sum<40))

## # A tibble: 1 x 1

## prob

## <dbl>
## 1 0.835
```