

# Problem Set 5

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## Problem 1

Apply Inverse Transform Method to Laplace distribution

$$\begin{aligned} f(x) &= \frac{\lambda}{2} e^{-\lambda|x-\theta|} \\ &= e^{-2|x-2|} \end{aligned} \quad (\lambda = 2, \theta = 2)$$

Break into cases for absolute

$$\begin{aligned} f(x) &= e^{-2(x-2)} & x > 2 \\ f(x) &= e^{2(x-2)} & x < 2 \end{aligned}$$

Integrate to find F(x)

$$\begin{aligned} f(x) &= 1 - \frac{1}{2} \cdot e^{-2x+4} & x > 2 \\ f(x) &= \frac{1}{2} \cdot e^{2x-4} & x < 2 \end{aligned}$$

Invert by setting = to U

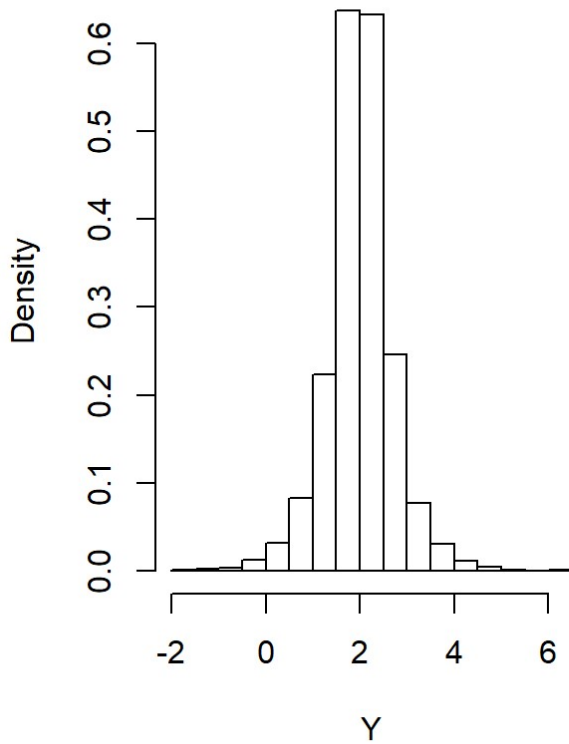
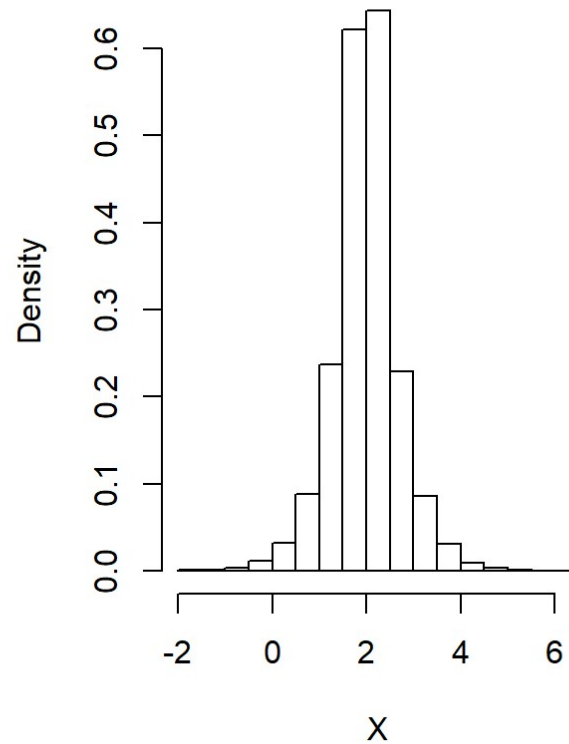
$$\begin{aligned} x &= -\frac{1}{2} [\log(-2u + 2) - 4] \\ x &= \frac{1}{2} [\log(2u) + 4] \end{aligned}$$

We see that the two values of X are equally likely so we integrate from 0 to 0.5 and 0.5 to 1 over U. This is demonstrated with R code below. I've also compared the derived distribution to the Laplace distribution generated by the R function *rlaplace* in package *rmutil*

```
Nsim <- 10^4
U <- runif(Nsim, min=0, max=1)

## From the actual Laplace distribution through rmutil package
# m = theta = 2 & s = 1/lambda = (1/2)
Y <- rlaplace(Nsim, m=2, s=(1/2))

## Generate from the inverse transform method
X <- ifelse(U>.5, (log(-2*(U) + 2)-4)/(-2),
           ifelse(U<.5, (log(2*U)+4)/(2), 2))
par(mfrow = c(1,2))
hist(Y, freq=F, main= "Laplace from rmutil")
hist(X, freq=F, main= "Laplace from Uniform")
```

**Laplace from rmutil****Laplace from Uniform**

## Problem 2

Let Random variable X has pdf:

$$f(x) = \begin{cases} (1/4) & 0 < x < 1 \\ x - (3/4) & 1 \leq x \leq 2 \end{cases}$$

### (a) Gen a r.v. using inverse transform method 1. First we integrate to find F(x)

$$\begin{aligned}
 0 < x < 1 \quad F(x) &= \int_{-\infty}^x \\
 &= \int_{-\infty}^0 dt + \int_0^x \frac{1}{4} \\
 &= \frac{t}{4} \Big|_0^x \\
 &= \frac{x}{4} \\
 1 \leq x \leq 2 \quad F(X) &= \int_{-\infty}^x \\
 &= \int_{-\infty}^0 dt + \int_0^1 \frac{1}{4} dt + \int_1^x (t - (3/4)) dt \\
 &= \frac{1}{4} + \left[ \frac{1}{2} t^2 - \frac{3}{4} t \right]_1^x \\
 &= \frac{1}{4} + \left[ \frac{1}{2} x^2 - \frac{3}{4} x \right] - \left[ \frac{1}{2} - \frac{3}{4} \right] \\
 &= \frac{1}{2} x^2 - \frac{3}{4} x + \frac{1}{2} \\
 F(x) &= \begin{cases} \frac{1}{4} x & 0 < x < 1 \\ \frac{1}{2} x^2 - \frac{3}{4} x + \frac{1}{2} & 1 \leq x \leq 2 \end{cases}
 \end{aligned}$$

2. Find  $F^{-1}(x)$  by setting equal to U and solving for x:

$$\begin{aligned}
 U = \frac{1}{4} &\implies x = 4U|_0^{0.25} \\
 U = \frac{1}{2}x^2 - \frac{3}{4}x + \frac{1}{2} &\implies x = \frac{1}{4}(3 \mp \sqrt{32U - 7})|_{0.25}^1
 \end{aligned}$$

3. Using R and a uniform distribution from 0,1 with each x having equal probability for U: (R code and plot provided at the end of the problem). See that the histogram follows the line generated from plotting f(x) very well.

## (b) Gen a r.v. using the accept reject method

We don't really need to do any fancy calculations for the max, so observe that:

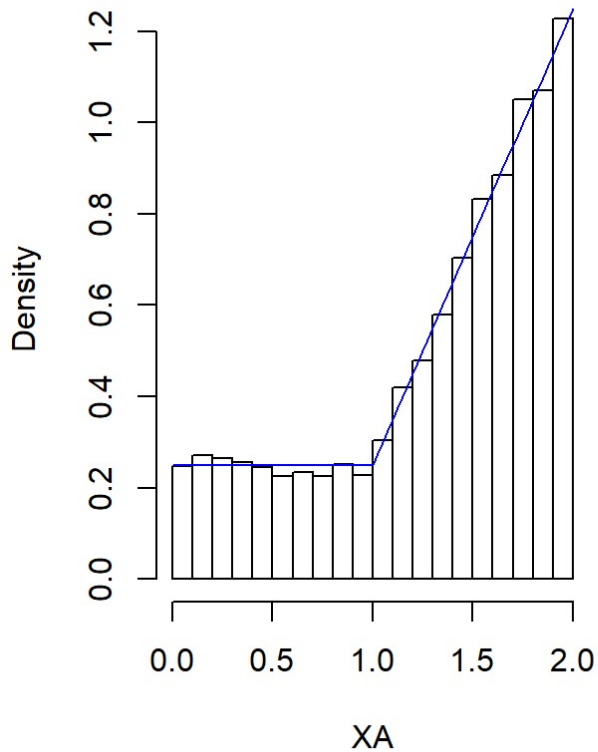
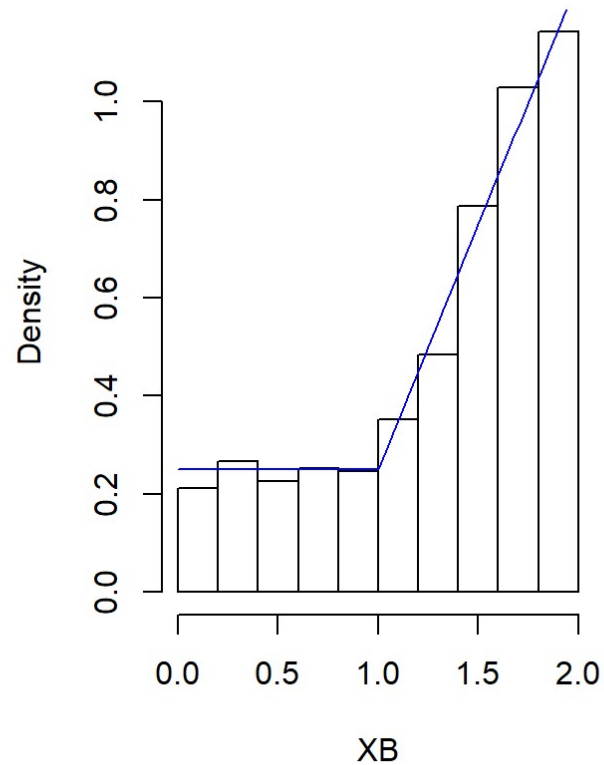
$$\sup(f(x)) = x - (3/4)|_{x=2} \implies x_{opt} = (5/4) \rightarrow M = \frac{f((5/4))}{g((5/4))} = 2$$

The rest is demonstrated in the R code below under PART (b)

```
## PART (a) USING THE INVERSE TRANSFORM METHOD
# Set the number of simulations
Nsim <- 10^4
# Generate the uniform values to plug into the inverse
U <- runif(Nsim , min=0,max=1)
# Evaluate the inverse for the Us
XA <- ifelse(U<(1/4),4*U,ifelse(U>(1/4),(1/4)*(3 + sqrt(32*U -7)),NA))

## PART (b) USING ACCEPT REJECT
# Set the max
M <- (2)
# Set the function
fx <- function(x){
  ifelse((x<1),(1/4),ifelse((1<=x & x<= 2),x-(3/4),NA))
}
# Generate x candidates over the range under consideration
Xcand <- runif(Nsim,min=0,max=2)
# Generate y candidates up to M
Ycand <- runif(Nsim, min=0, max=M)
# Keep the x candidates for which the Y candidates are viable solutions
XB <- Xcand[Ycand < fx(Xcand)]

## Plots for (a) and (b)
par(mfrow = c(1,2))
hist(XA,freq=F,main="Hist via Inverse transform")
plot(fx,xlim=c(0,2.5),ylim=c(0,2.5),col = "blue",add=TRUE)
hist(XB,freq=F,main="Hist via Accept Reject")
plot(fx,xlim=c(0,2.5),ylim=c(0,2.5),col = "blue",add=TRUE)
```

**Hist via Inverse transform****Hist via Accept Reject**

## Problem 3

Let Randomn variable X has pdf:

$$f(x) = \begin{cases} (1/2)x & 0 < x < 1 \\ (1/2) & 1 \leq x \leq \frac{5}{2} \end{cases}$$

1. First we integrate to find F(x)

$$\begin{aligned}
0 < x < 1 \quad F(x) &= \int_{-\infty}^x f(t) dt = \int_{-\infty}^0 0 dt + \int_0^x \frac{t}{2} dt \\
&= \frac{t^2}{4} \Big|_0^x \\
&= \frac{x^2}{4} \\
1 \leq x \leq 2 \quad F(x) &= \int_{-\infty}^x f(t) dt = \int_{-\infty}^0 0 dt + \int_0^1 \frac{t}{2} dt + \int_1^x \frac{1}{2} dt \\
&= \frac{1}{4} + \frac{t}{2} \Big|_1^x \\
&= \frac{1}{4} + \frac{x}{2} - \frac{1}{2} \\
&= \frac{x}{2} - \frac{1}{4} \\
F(x) &= \begin{cases} \frac{1}{4}x^2 & 0 < x < 1 \\ \frac{1}{2}x - \frac{1}{4} & 1 \leq x \leq 2 \end{cases}
\end{aligned}$$

2. Find  $F^{-1}(x)$  by setting equal to U and solving for x:

$$\begin{aligned}
U &= \frac{1}{4}x^2 \quad \implies x = \sqrt{4U} \Big|_0^{0.25} \\
U &= \frac{1}{2}x - \frac{1}{4} \quad \implies x = 2U + \frac{1}{2} \Big|_{0.25}^1
\end{aligned}$$

3. Using R and a uniform distribution from 0,1 with each x having equal probability for U: (R code and plot provided at the end of the problem). See that the histogram follows the line generated from plotting f(x) very well.

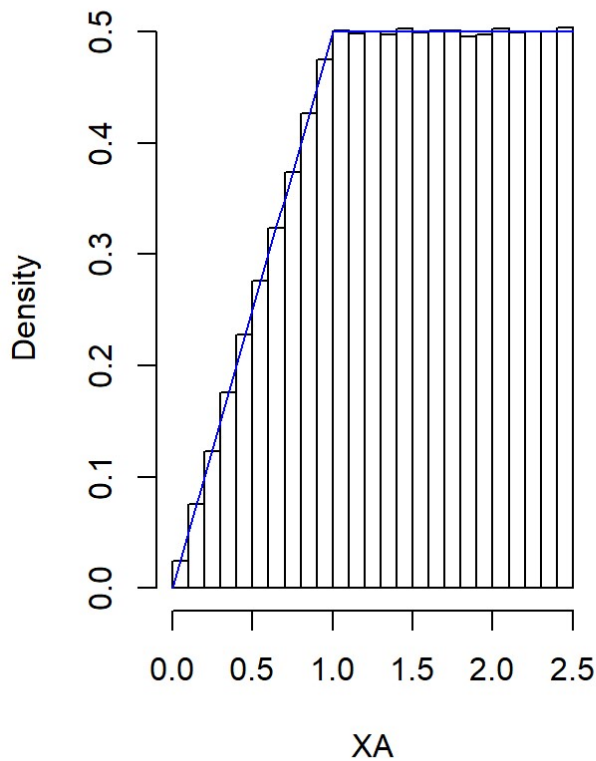
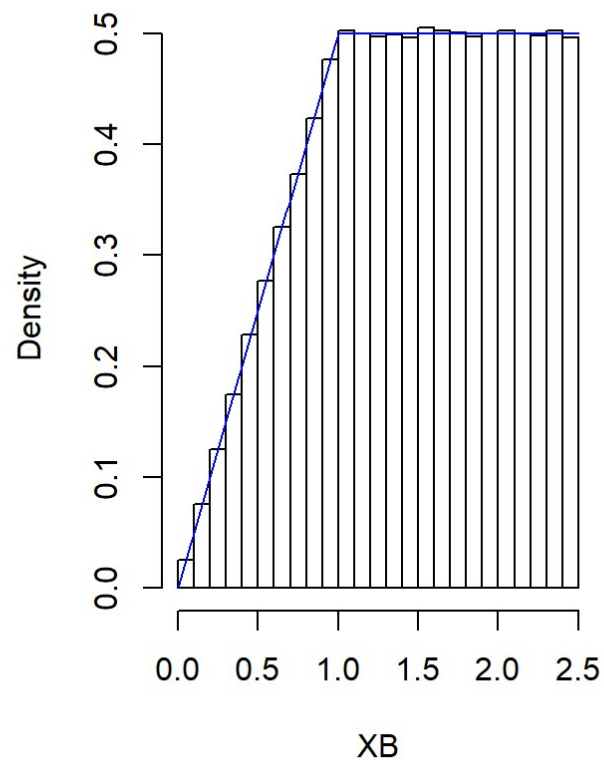
(b) Gen a r.v. using the accept reject method

$$\sup(f(x)) = (1/2) \Big|_{x=1} \implies x_{opt} = \frac{16}{25} \rightarrow M = \frac{f(1/2)}{g(1/2)}$$

```
## PART (a) USING THE INVERSE TRANSFORM METHOD
# Set the number of simulations
Nsim <- 10^6
# Generate the uniform values to plug into the inverse
U <- runif(Nsim , min=0,max=(1))
# Evaluate the inverse for the Us
XA <- ifelse(U<(1/4),sqrt(4*U),ifelse(U>(1/4),2*U+(1/2),NA))

## PART (b) USING ACCEPT REJECT
# Set the max
M <- ((1/2))
# Set the function
fx <- function(x){
  ifelse((x<1),(x/2),ifelse((1<=x & x<= 2.5),(1/2),NA))
}
# Generate x candidates over the range under consideration
Xcand <- runif(Nsim,min=0,max=2.5)
# Generate y candidates up to M
Ycand <- runif(Nsim, min=0, max=M)
# Keep the x candidates for which the Y candidates are viable solutions
XB <- Xcand[Ycand < fx(Xcand)]

## Plots for (a) and (b)
par(mfrow = c(1,2))
hist(XA,freq=F,main="Hist via Inverse transform")
plot(fx,xlim=c(0,2.5),ylim=c(0,2.5),col = "blue",add=TRUE)
hist(XB,freq=F,main="Hist via Accept Reject")
plot(fx,xlim=c(0,2.5),ylim=c(0,2.5),col = "blue",add=TRUE)
```

**Hist via Inverse transform****Hist via Accept Reject**

## Problem 4

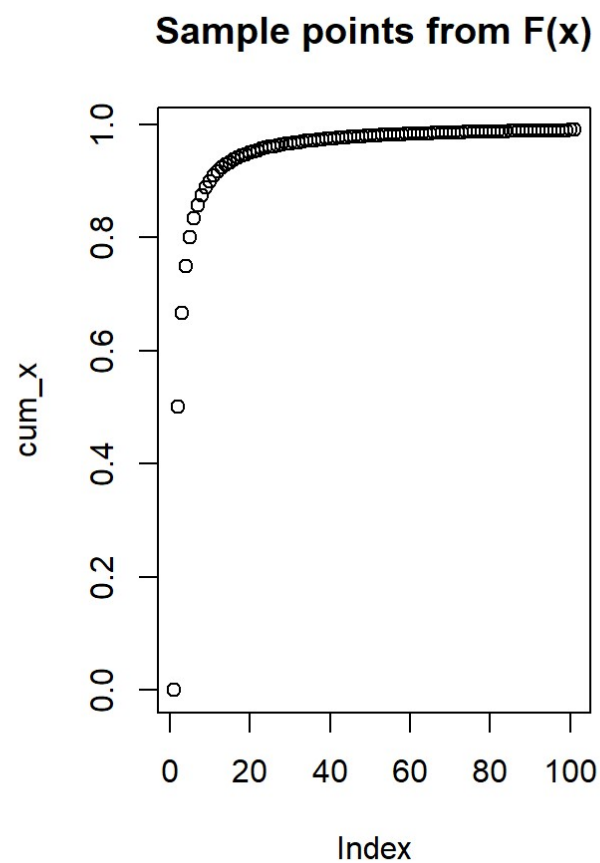
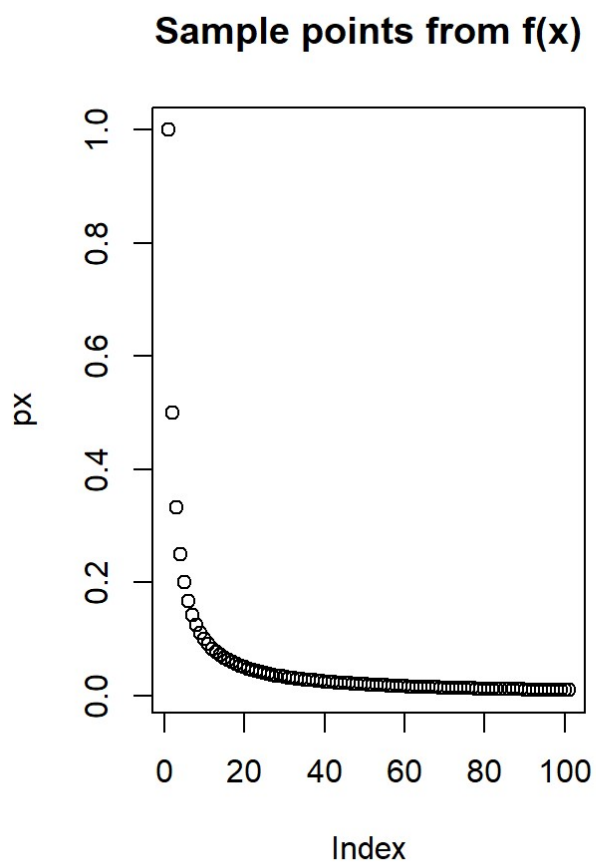
Apply the inverse-transform method to generate a random variable from the discrete uniform distribution with pdf

$$f(x) = \begin{cases} \frac{1}{n+1} & x = 0, 1, \dots, n \\ 0 & \text{otherwise} \end{cases}$$

First I wanted to get an idea of what this might look like. In doing this I computed  $F(X) = \frac{x}{n+1}$  which makes sense when you look at the cumulative normal distribution plot:

```
n <- seq(0,100)
px <- (1/(n+1))
cum_x <- (n/(n+1))
par(mfrow = c(1,2))
plot(px,main = "Sample points from f(x)")
plot(cum_x, main= "Sample points from F(x)")
```





Using the inverse transform method it is clear that  $X = U(n + 1)$  where  $U \sim \text{unif}(0, 1)$ . With this I made the following histogram. It doesn't look perfect but It gets the general idea.

```
U <- runif(100,min=0,max=1)
x <- U*(n+1)
```

```
## Warning in U * (n + 1): longer object length is not a multiple of shorter
## object length
```

```
hist(x,freq=F,breaks=seq(0,100,5))
```

