STAT580 HOMEWORK3

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Problem1

(a)

$$P\{U \le r(X)\} = \int_{\chi} P\{U \le r(x), \ X = x\} dx$$

$$P\{U \le r(x), \ X = x\} = P\{U \le r(x) | X = x\} g(x) = P\{U \le r(x)\} g(x)$$

$$P\{U \le r(X)\} = \int_{\chi} P\{U \le r(x)\} g(x) dx = \int_{\chi} \frac{q(x)}{\alpha g(x)} g(x) dx = \frac{1}{\alpha} \int_{\chi} q(x) dx$$

(b)

Similarly, we have:

$$\begin{split} P\{U \leq r(X), \ X \in A\} &= \int_{\chi} P\{U \leq r(x), \ x \in A\} g(x) dx \\ & \because \int_{\chi} P\{U \leq r(x), \ x \in A\} g(x) dx = \int_{A} P\{U \leq r(x)\} g(x) dx \\ & \therefore \ P\{U \leq r(X), \ X \in A\} = \int_{A} P\{U \leq r(x)\} g(x) dx = \int_{A} \frac{q(x)}{\alpha g(x)} g(x) dx = \frac{1}{\alpha} \int_{A} q(x) dx \end{split}$$

(c)

We've already proved in class that:

$$P\{Y \in A\} = P\{X \in A | U \le r(X)\}$$

$$\therefore P\{Y \in A\} = \frac{P\{U \le r(X), X \in A\}}{P\{U \le r(X)\}}$$

$$\therefore \frac{P\{U \le r(X), X \in A\}}{P\{U \le r(X)\}} = \frac{\frac{1}{\alpha} \int_A q(x) dx}{\frac{1}{\alpha} \int_X q(x) dx} = \frac{\int_A q(x) dx}{\int_X q(x) dx}$$

$$\therefore \frac{\int_A q(x) dx}{\int_X q(x) dx} = \frac{\int_A cq(x) dx}{\int_X cq(x) dx} = \frac{\int_A f(x) dx}{\int_X f(x) dx} = \int_A f(x) dx$$

Problem2

(a)

Set:

$$q(x) = C(2x^{\theta-1}e^{-x} + x^{\theta-\frac{1}{2}}e^{-x})$$

Due to the property of pdf, we have:

$$\int_0^\infty g(x)dx \equiv 1$$

$$\therefore C = \frac{1}{\int_0^\infty (2x^{\theta-1}e^{-x} + x^{\theta-\frac{1}{2}}e^{-x})dx} = \frac{1}{2\int_0^\infty x^{\theta-1}e^{-x}dx + \int_0^\infty x^{\theta-\frac{1}{2}}e^{-x}dx} = \frac{1}{2\Gamma(\theta) + \Gamma(\theta + \frac{1}{2})}$$

(b)

Set: $X \sim Gamma(\theta, 1), \ Y \sim Gamma(\theta + \frac{1}{2}, 1).$ Therefore, we have:

$$f_X(x) = \frac{1}{\Gamma(\theta)} x^{\theta - 1} e^{-x}$$

$$f_Y(x) = \frac{1}{\Gamma(\theta + \frac{1}{2})} x^{\theta - \frac{1}{2}} e^{-x}$$

$$\therefore g(x) = C_1 f_X(x) + C_2 f_Y(x)$$

where:

$$C_1 = \frac{2\Gamma(\theta)}{2\Gamma(\theta) + \Gamma(\theta + \frac{1}{2})} \quad ; \ C_2 = \frac{\Gamma(\theta + \frac{1}{2})}{2\Gamma(\theta) + \Gamma(\theta + \frac{1}{2})}$$

(c)

$$g(x) = C_1 f_X(x) + C_2 f_Y(x) , \quad C_1 + C_2 = 1$$

$$\int_A g(x) = C_1 \int_A f_X(x) + C_2 \int_A f_Y(x)$$

$$\therefore P(Z \in A) = C_1 P(X \in A) + C_2 P(Y \in A) , where Z \sim g(x)$$

$$\therefore P(Z \in A) = C_1 P(Z \in A | Z \stackrel{d}{=} X) + C_2 P(Z \in A | Z \stackrel{d}{=} Y)$$

Define:

$$C_1 = P(Z \stackrel{d}{=} X), \quad C_2 = P(Z \stackrel{d}{=} Y)$$

 $\cdots \quad P(Z \stackrel{d}{=} X) + P(Z \stackrel{d}{=} Y) = 1$

Which means Z can only obey to $Gamma(\theta, 1)$ or $Gamma(\theta + \frac{1}{2}, 1)$.

Set:

$$W = \begin{cases} 1, & Z \sim Gamma(\theta, 1) \\ 0, & Z \sim Gamma(\theta + \frac{1}{2}, 1) \end{cases}$$

$$\therefore P(Z \in A) = P(Z \in A|W = 1)P(W = 1) + P(Z \in A|W = 0)P(W = 0)$$

It means P(Z) is the marginal distribution of P(Z, W).

$$P(Z, W) = P(Z|W)P(W)$$

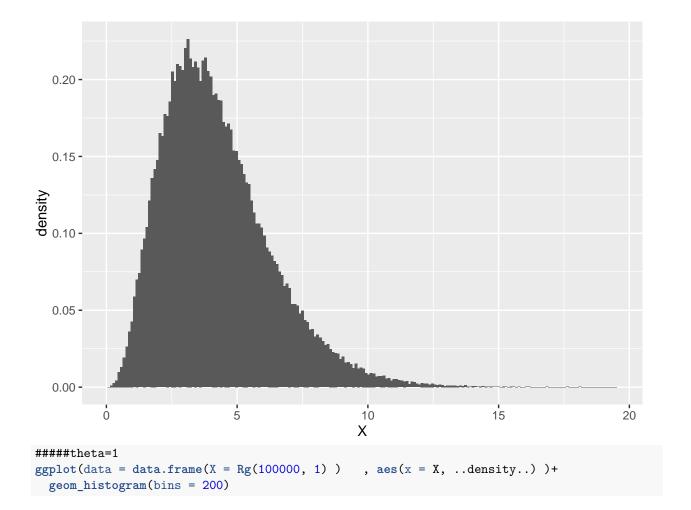
Therefore, we can generated (Z, W) by generating W first and generating Z by P(Z|W). So, the algorithm is:

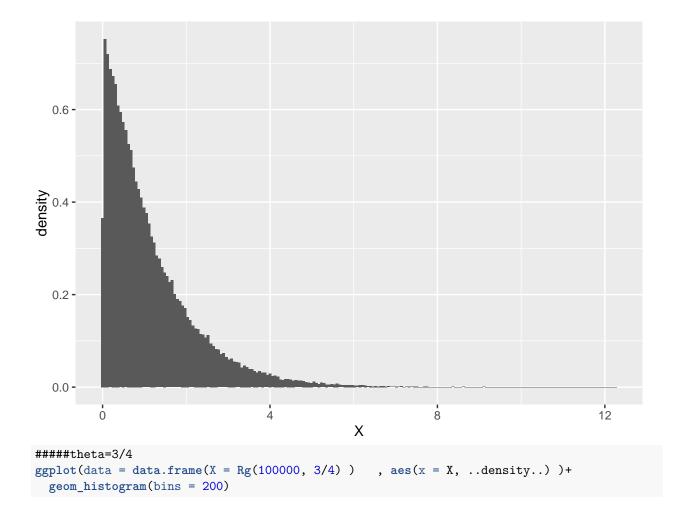
Algorithm:

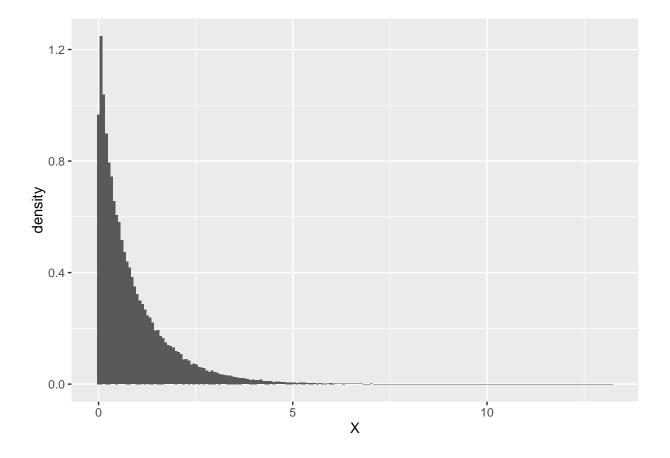
- 1. Generate $U \sim Unif(0,1)$.
- 2. if $U < \frac{2\Gamma(\theta)}{2\Gamma(\theta) + \Gamma(\theta + \frac{1}{2})}$. Generate $Z \sim Gamma(\theta, 1)$. else, Generate $Z \sim Gamma(\theta + \frac{1}{2}, 1)$.

code:

```
Rg \leftarrow function(n = 1, theta = 1)
  f<-function(x,a){</pre>
    x^(a-1) * exp(-x)
  c1 <- integrate(f, a = theta, lower = 0, upper = Inf)[[1]]</pre>
  c2 <- integrate(f, a = theta+1/2, lower = 0, upper = Inf)[[1]]
  C \leftarrow 2*c1/(2*c1+c2)
  U <- runif(n)
  index \leftarrow (U < C)
  m <- sum(index)</pre>
  X \leftarrow rep(0,n)
  X1 <- rgamma(m, theta, 1)
  X2 \leftarrow rgamma(n-m, theta+1/2, 1)
  X[index] <- X1</pre>
  X[!index] \leftarrow X2
  return(X)
}
####theta=4
library(ggplot2)
ggplot(data = data.frame(X = Rg(100000, 4)), aes(x = X, ..density..))+
  geom_histogram(bins = 200)
```







(d)

Set:

$$q(x) = C\sqrt{4+x} x^{\theta-1}e^{-x}$$

$$\therefore \frac{q(x)}{\alpha g(x)} = \frac{C\sqrt{4+x} x^{\theta-1}e^{-x}}{\alpha C(2x^{\theta-1}e^{-x} + x^{\theta-\frac{1}{2}}e^{-x})} = \frac{\sqrt{4+x}}{2+\sqrt{x}} \frac{1}{\alpha}$$

$$\therefore \alpha = \sup \frac{q(x)}{g(x)}$$

$$\therefore (\sqrt{4+x})^2 = 4 + x \le 4 + x + 4\sqrt{x} = (2+\sqrt{x})^2$$

$$\therefore \frac{(\sqrt{4+x})^2}{(2+\sqrt{x})^2} \le 1$$

$$\therefore \frac{\sqrt{4+x}}{2+\sqrt{x}} \le 1$$

When $x=0,\,\alpha$ gets to the maximum, 1. Therefore, $\alpha=1.$ So, the algorithm is:

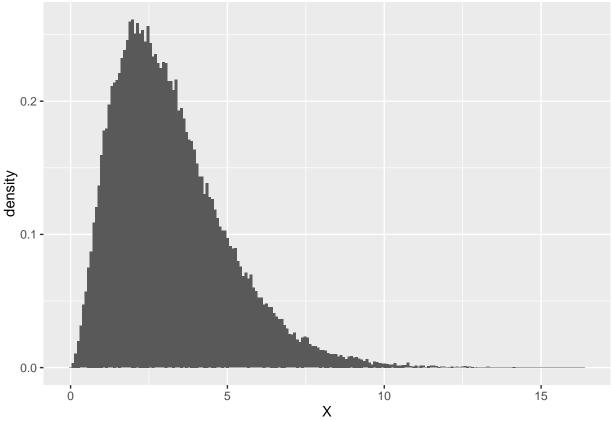
Algorithm:

- 1. Generate $U \sim Unif(0,1)$ and $X \sim g(x)$ independently.
- 2. If $U > \frac{\sqrt{4+X}}{2+\sqrt{X}}$, then go to step 1. Otherwise, return X.

Code:

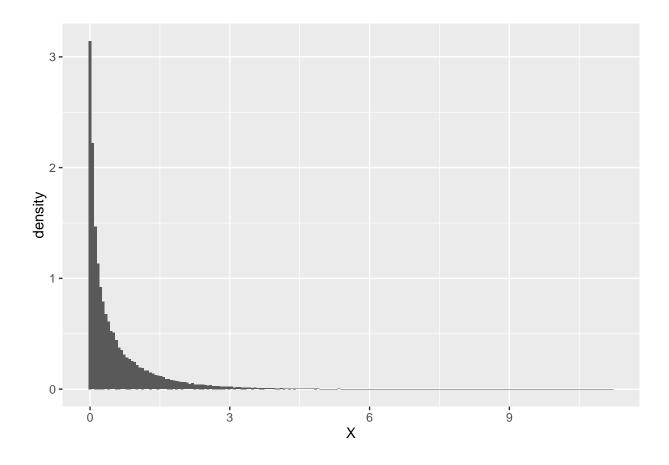
```
###theta=3
U <- runif(100000)
X <- Rg(100000, theta=3)

Index <- ( U <= sqrt(4+X)/(sqrt(X)+2) )
Xf <- X[Index]
ggplot(data = data.frame(X = Xf ) , aes(x = X, ..density..))+
    geom_histogram(bins = 200)</pre>
```



```
###theta=1/2
U <- runif(100000)
X <- Rg(100000, theta=1/2)

Index <- ( U <= sqrt(4+X)/(sqrt(X)+2) )
Xf <- X[Index]
ggplot(data = data.frame(X = Xf ) , aes(x = X, ..density..))+
    geom_histogram(bins = 200)</pre>
```



Problem3

C Code:

```
#include<stdio.h>
#define n 16 /* number of observations */
#define p 2 /* number of predictors */
void dgesv_(int *N, int *NRHS, double *A, int *LDA, int *IPIV,
                 double *B, int *LDB, int *INFO);
void dgemm_(char *TRANSA, char *TRANSB, int *M, int *N, int *K,
        double *ALPHA, double *A, int *LDA, double *B, int *LDB,
        double *BETA, double *C, int *LDC);
int main(){
/* longley dataset from R: Employed (Y) GNP.deflator and Population (X) */
    double Y[n] = \{60.323,61.122,60.171,61.187,63.221,63.639,64.989,
                   63.761,66.019,67.857,68.169,66.513,68.655,69.564,
                   69.331,70.551};
    double X[n][p] =
    {{83,107.608},
    {88.5,108.632},
```

```
{88.2,109.773},
{89.5,110.929},
{96.2,112.075},
{98.1,113.27},
{99,115.094},
{100,116.219},
{101.2,117.388},
{104.6,118.734},
{108.4,120.445},
{110.8,121.95},
{112.6,123.366},
{114.2,125.368},
{115.7,127.852},
{116.9,130.081}};
int i,j,k;
double X1[n*(p+1)];
char trans = 'T', no_trans = 'N';
double alpha = 1, beta = 0;
int K = n;
int N_X = p+1;
int N_Y = 1;
double XX[(p+1)*(p+1)], XY[(p+1)];
int info;
int ipiv[p+1];
for (k=0; k< n; k++){
    X1[k] = 1;
}
for (i=1; i<p+1; i++){</pre>
    for (j=0; j<n; j++){</pre>
        X1[i*n+j] = X[j][i-1];
    }
}
dgemm_(&trans, &no_trans, &N_X, &N_X, &K, &alpha, X1, &K, X1,
        &K, &beta, XX, &N_X);
dgemm_(&trans, &no_trans, &N_X, &N_Y, &K, &alpha, X1, &K, Y,
        &K, &beta, XY, &N_X);
dgesv_(&N_X, &N_Y, XX, &N_X, ipiv, XY, &N_X, &info);
if (info == 0){
    printf("The regression coefficients:\t");
    for (i = 0; i<N_X; i++){</pre>
        printf("%f\t", XY[i]);
    }
  printf("\n");
```

```
else printf("dgesv error %d\n", info);
return (0);
}
```

Output:

```
[[xguo@smaster STAT580]$ gcc -Wall -ansi -pedantic hw3_3.c -llapack -lblas
[[xguo@smaster STAT580]$ ./a.out
The regression coefficients: 26.851352 0.240842 0.119026
[xguo@smaster STAT580]$
```

Figure 1: Output of (3)

Problem4

C Code:

```
#include<stdio.h>
#include<stdlib.h>
#include<assert.h>
#define n 16 /* number of observations */
#define p 2 /* number of predictors */
void dgesvd_(char *JOBU, char *JOBVT, int *M, int *N, double *A,
        int *LDA, double *S, double *U, int *LDU, double *VT,
        int *LDVT, double *WORK, int *LWORK, int *INFO);
int main(){
    /* longley dataset from R */
    double X[n][p] =
    {{83,107.608},
    {88.5,108.632},
    {88.2,109.773},
    {89.5,110.929},
    {96.2,112.075},
    {98.1,113.27},
    {99,115.094},
    {100,116.219},
    {101.2,117.388},
    {104.6,118.734},
    {108.4,120.445},
    {110.8,121.95},
    {112.6,123.366},
    {114.2,125.368},
    {115.7,127.852},
```

```
{116.9,130.081}};
int i, j, info;
double X_sum[p], Z[n*p];
char jobu = 'S';
char jobvt = 'A';
int MA = n;
int NA = p;
double S[p], U[n*p], VT[p*p];
int lwork = -1;
double wkopt;
double *work;
double UD[n][p];
for (j=0; j<p; j++){
    X_{sum}[j] = 0;
    for (i=0; i<n; i++){</pre>
        X_{sum}[j] = X_{sum}[j] + X[i][j];
}
for (j=0; j<p; j++){</pre>
    for (i=0; i<n; i++){</pre>
        Z[i+n*j] = X[i][j] - X_sum[j]/n;
}
dgesvd_(&jobu, &jobvt, &MA, &NA, Z, &MA, S, U, &MA, VT, &NA, &wkopt,
        &lwork, &info);
 lwork = (int)wkopt;
 work = (double*)malloc( lwork*sizeof(double) );
 assert(work != NULL);
 dgesvd_(&jobu, &jobvt, &MA, &NA, Z, &MA, S, U, &MA, VT, &NA, work,
        &lwork, &info);
if (info == 0){
    printf("The principal component scores:\n");
    for (i=0; i<n; i++){</pre>
        for (j=0; j<p; j++){
            UD[i][j] = U[i+j*n]*S[j];
            printf("%f\t", UD[i][j]);
        printf("\n");
    }
else printf("dgesvd error %d\n", info);
return (0);
```

}

Output:

```
[[xguo@smaster STAT580]$ gcc -Wall -ansi -pedantic hw3_4.c -llapack -lblas
[[xguo@smaster STAT580]$ ./a.out
The principal component scores:
-21.027360     1.786917
 -15.841324
                        -0.311559
 -15.479775
-13.761879
                        0.811456
                        1.085622
 -7.498950
-5.254453
                        -1.556165
                        -1.572194
 -3.513952
                        -0.519752
 -2.065548
                        -0.110180
 -0.424918
                        0.228784
                        -0.467648
-1.071878
3.164887
7.288287
10.121032
                        -1.095894
12.400256
14.826466
                        -0.871850
                        -0.046314
1.239231
17.427933
19.639299
                        2.471424
 [xguo@smaster STAT580]$
```

Figure 2: Output of (4)

Problem5

C Code:

```
#include<stdio.h>
#define N 10
int main(){
    double x[N] = \{3.1, -1.2, 5.3, 1, 4.4, 21, 3, 7, -1.2, 3.2\};
    double *p, *q, *r;
    int i;
    double temp;
    printf("Original data:\n");
    for (i=0; i<N; i++){</pre>
        printf("%f\n",x[i]);
    for (i=1; i<N; i++){</pre>
        r = &x[i];
        p = r;
        q = r-1;
        while (*p < *q){
                 temp = *p;
                 *p = *q;
```

```
*q = temp;
                if (q == x) break;
                p--;
                q--;
    }
    printf("Sorted data:\n");
    for (i=0; i<N; i++){</pre>
       printf("%f\n",x[i]);
    printf("\n");
    printf("median = ");
    if ((double)N/2 - (int)(N/2) == 0){
       printf("f\n", (x[(N/2)-1]+x[N/2])/2);
    }
    else{
           printf("%f\n", x[(N-1)/2]);
       }
   return (0);
}
```

Output:

```
[xguo@smaster STAT580]$ gcc -Wall -ansi -pedantic hw3_5.c
[xguo@smaster STAT580]$ ./a.out
Original data:
3.100000
-1.200000
5.300000
1.000000
4.400000
21.000000
3.000000
7.000000
-1.200000
3.200000
Sorted data:
-1.200000
-1.200000
1.000000
3.000000
3.100000
3.200000
4.400000
5.300000
7.000000
21.000000
median = 3.150000
[xguo@smaster STAT580]$
```

Figure 3: Output of (5)