

# 「モデリングとシミュレーション特論」課題（解答例）

2019/5/21

## 1 乱数と MonteCarlo 法

課題 1 Consider a probability density defined by Eq. (1.1) in  $[0, 1)$  (Fig. 1). Generate random numbers obeying Eq. (1.1) by transformation method. And show the histogram for generated random numbers. The reference is `randomNumbers/Exp.java`.

$$f(x) = \begin{cases} 4x & 0 \leq x < 1/2 \\ 4 - 4x & 1/2 \leq x < 1 \end{cases} \quad (1.1)$$

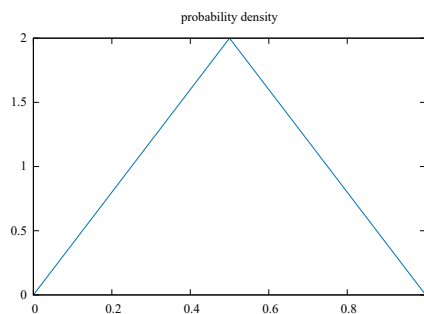


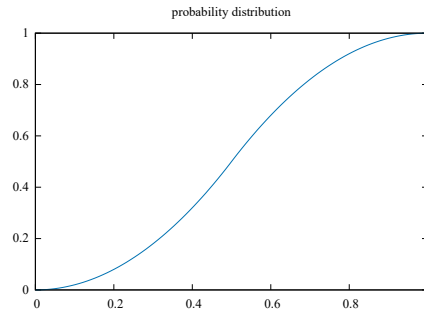
図 1 probability density

解答例 For applying transformation method to generate random numbers, we need to have the reverse of the probability distribution. For  $0 \leq x < 1/2$ , the probability distribution  $F(x)$  is

$$F(x) = \int_0^x f(y)dy = \int_0^x 4ydy = 2x^2,$$

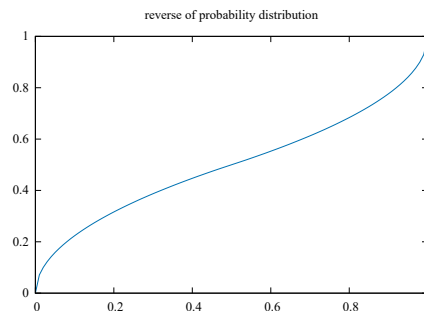
and for  $1/2 \leq x < 1$ ,

$$\begin{aligned} F(x) &= \frac{1}{2} + \int_{1/2}^x f(y)dy = \frac{1}{2} + \int_{1/2}^x (4 - 4y)dy \\ &= \frac{1}{2} + [4y - 2y^2]_{1/2}^x = -2x^2 + 4x - 1. \end{aligned}$$



The reverse function of the distribution  $F(x)$  is

$$F^{-1}(x) = \begin{cases} \left(\frac{x}{2}\right)^{1/2} & 0 \leq x < 1/2, \\ 1 - \left(\frac{1-x}{2}\right)^{1/2} & \text{otherwise.} \end{cases}$$



By reference to the sample program `randomNumbers/Exp.java`, we can implement the random number generator as in Source Code 1.

Source Code 1 ExampleRandom.java

```

1 package exercise;
2
3 import histogram.Histogram;
4 import java.awt.geom.Point2D;
5 import java.io.BufferedWriter;
6 import java.io.IOException;

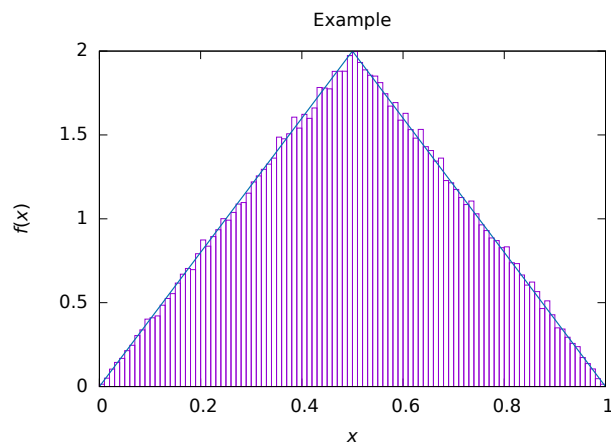
```

```

7 import java.util.List;
8 import java.util.function.DoubleFunction;
9 import myLib.utils.FileIO;
10 import randomNumbers.AbstractRandom;
11 import randomNumbers.Exp;
12 import randomNumbers.Transform;
13
14 /**
15  *
16  * @author tadaki
17  */
18 public class ExampleRandom {
19
20     /**
21      * @param args the command line arguments
22      */
23     public static void main(String[] args) throws IOException {
24         DoubleFunction<Double> invProDist = x -> {
25             if (x < .5) {
26                 return Math.sqrt(x / 2.);
27             }
28             return 1. - Math.sqrt((1.-x)/2.);
29         };
30
31         //変換法による乱数生成のインスタンス
32         AbstractRandom aRandom = new Transform(invProDist);
33
34         double min = 0.;//下限
35         double max = 1.;//上限
36         int numBin = 100;//bin の数
37         int numSamples = 100000;//乱数の総数
38         //ヒストグラムを生成
39         Histogram histogram = new Histogram(min, max, numBin);
40         for (int i = 0; i < numSamples; i++) {
41             double x = aRandom.getNext();
42             histogram.put(x);
43         }
44         //ヒストグラムを出力
45         List<Point2D.Double> plist = histogram.calculateFrequency();
46         String filename = ExampleRandom.class.getSimpleName() + "-output.txt";
47         try (BufferedWriter out = FileIO.openWriter(filename)) {
48             for (Point2D.Double p : plist) {
49                 FileIO.writeSSV(out, p.x, p.y);
50             }
51         }
52     }

```

We obtain the histogram for this random numbers. The result shows that Source code 1 generates random numbers defined by Eq. (1.1).



**課題 2** Derive the average  $\mu$  and variance  $\sigma^2$  for the probability density (Eq. 1.1) analytically.

解答例

$$\begin{aligned}\mu &= \langle x \rangle = \int_0^1 x f(x) dx = \int_0^{1/2} 4x^2 dx + \int_{1/2}^1 x(4-4x) dx \\ &= \left[ \frac{4}{3} x^3 \right]_0^{1/2} + \left[ 2x^2 - \frac{4}{3} x^3 \right]_{1/2}^1 = \frac{1}{2}, \\ \langle x^2 \rangle &= \int_0^1 x^2 f(x) dx = \int_0^{1/2} 4x^3 dx + \int_{1/2}^1 4x^2(1-x) dx \\ &= \left[ x^4 \right]_0^{1/2} + \left[ \frac{3}{4} x^4 - x^4 \right]_{1/2}^1 = \frac{5}{24}, \\ \sigma^2 &= \langle x^2 \rangle - \mu^2 = \frac{1}{24}.\end{aligned}$$

**課題 3** At the lecture, we observe the law of large numbers for uniform random numbers. Observe the law for the case defined by Eq. (1.1). The reference is `LawOfLargeNumbers/LargeNumbers.java`.

解答例 By the reference to the sample program `LawOfLargeNumbers/LargeNumbers.java`, we construct the simulation program as Source Code 2

Source Code 2 LargeNumbersExercise.java

```
1 package exercise;
2
3 import LawOfLargeNumbers.*;
4 import randomNumbers.AbstractRandom;
5 import java.io.BufferedWriter;
6 import java.io.IOException;
7 import java.util.List;
8 import java.util.function.DoubleFunction;
9 import myLib.utils.FileIO;
10 import randomNumbers.Transform;
11
12 /**
13  * 大数の法則を確認する。
14  *
15  * @author tadaki
16  */
17 public class LargeNumbersExercise {
18
19     public static void main(String args[]) throws IOException {
20         int nSamples = 1000; //各サイズの標本数
21         int num = 16; //標本サイズ初期値
22         int numMax = 16384; //標本サイズ最大値
23         DoubleFunction<Double> invProDist = x -> {
24             if (x < .5) {
25                 return Math.sqrt(x / 2.);
26             }
27             return 1. - Math.sqrt((1.-x)/2.);
28         };
29
30         //変換法による乱数生成のインスタンス
31         AbstractRandom myRandom = new Transform(invProDist);
32
33         LargeNumbers ln = new LargeNumbers(myRandom);
34         List<Result> plist = ln.observeSizeDependence(num, numMax, nSamples);
35
36         //結果出力
37         String filename = LargeNumbersExercise.class.getSimpleName() + ".txt";
38         try (BufferedWriter out = FileIO.openWriter(filename)) {
39             for (Result p : plist) {
40                 out.write(p.toString());
41                 out.newLine();
42             }
43         }
```

44 }  
45 }

We find that the averages of samples are that of the population. And they converges to the population mean as  $\sigma n^{-1/2}$ .

