

## Monte Carlo simulation methods

## Homework 2, 18.10.2007

Return the solutions (with program printouts) at the latest at the beginning of the 18.10. exercise session. You can also e-mail the solutions to Ahti Leppänen, <ahtilepp AT mail.student.oulu.fi>.

1. Let us consider a system of 2 real degrees of freedom,  $x$  and  $y$ , with a (dimensionless) energy function

$$H(x, y) = x^2 + y^2 + 5(x - y)^2 \quad p(x, y) \propto e^{-H(x, y)}$$

Write a Metropolis update algorithm for the system, i.e. update the variables  $x$  and  $y$  in turns, using the method described in page 42 of the notes. Measure  $(x - y)^2$  and  $(x + y)^2$  after every update step, and do at least  $\sim 10000$  updates. What is the result for  $\langle (x - y)^2 \rangle$  and  $\langle (x + y)^2 \rangle$ ?

For checking the results: it is easy to calculate the result analytically, using variables  $a = x - y$ ,  $b = x + y$ .

2. RANDU is a notorious random number generator; it was the standard generator in IBM mainframes in 60's. It is defined by

$$I_i = (65539I_{i-1}) \bmod 2^{31} \quad x_i = I_i/2^{31}$$

Write a function which implements the generator, and a function which seeds it (naturally it can be the same function).

Note: in practically all present-day computers the size of the integer variable is 32 bits. Thus, the multiplication in the generator would cause overflow. However, the result is modded by  $2^{31}$ , i.e. only 31 low-order bits of the result remain.

The easiest way to do the multiplication is to use `unsigned int` (at least in C or C++). If `irnd` is of type `unsigned int`, then the product `(65539U * irnd)` is guaranteed to have the 32 low-order bits correct. Then it is easy to mod the result by  $2^{31}$ , i.e. the (integer) generator becomes

```
irnd = (65539U * irnd) % 2147483648U
```

Another option is to use double precision floating point arithmetics, or the Schrage method described in the notes.

- a) Measure the cycle time of the generator (by brute force). Repeat it by using a couple of different seeds (i.e. values of  $I_0$ ).
- b) Generate "2-tuples"  $(x, y) = (x_{2i}, x_{2i+1})$  from successive pseudorandom numbers and plot these on a plane (dots, not connected by lines). Let us zoom in to the small sub-square  $0 \leq x \leq 0.005$ ,  $0 \leq y \leq 0.005$ . Plot only those 2-tuples which fall within this square (but remember always generate numbers in pairs, and reject the pair if it is not within the square). Plot  $\sim 1000$  points within the square.

Do the test using seeds  $I_0 = 1, 4$  and  $32$ . What kind of pattern arises?