

# Worksheet 10: Random numbers

June 25, 2013

## General Remarks

- Deadline is **Tuesday, 2nd July 2013, 10:00**
- On this worksheet, you can achieve a maximum of 10 points.
- To hand in your solutions, send an email to
  - Olaf ([olenz@icp.uni-stuttgart.de](mailto:olenz@icp.uni-stuttgart.de); Wednesday, 14:00–15:30)
  - Elena ([minina@icp.uni-stuttgart.de](mailto:minina@icp.uni-stuttgart.de); Wednesday, 15:45–17:15)
  - Tobias ([richter@icp.uni-stuttgart.de](mailto:richter@icp.uni-stuttgart.de); Friday, 15:45–17:15)
- Attach all required files to the mailing. If asked to write a program, attach the *source code* of the program. If asked for a text, send it as PDF or in the text format. We will *not* accept MS Word files!
- The worksheets are to be solved in groups of two or three people. We will not accept hand-in-exercises that only have a single name on it.
- The tutorials take place in the CIP-Pool of the Institute for Computational Physics (ICP) in Allmandring 3.

## Task 10.1 (5 points): Quality analysis of random number sequences

The file `random.npy` contains 5 data sets of 100000 apparently random numbers in the interval  $[0, 1]$ . Copy this file to your home directory. Actually only one of those sequences was generated by a good random number generator. The others are in some way inconsistent.

With the following command you can load the data in python:

```
r1, r2, r3, r4, r5 = numpy.load('random.npy')
```

- Task 10.1.1 (1 point) Generate and plot histograms of the probability distribution for the different sequences by using the python function `matplotlib.pyplot.hist` with 100 *bins*. What shape of the distribution do you expect?
- 10.1.2 (1 point) Calculate the means for blocks of 10 consecutive random numbers and generate a histogram for the mean values (statistical  $\chi^2$ -test). Plot this together with the expected distribution of a real random number sequence.
- 10.1.3 (1 point) Fourier transform the sequences with `numpy.fft.rfft` and plot the absolute values of the Fourier coefficients semilogarithmically (*semilogy*).

- 10.1.4 (1 point) Write a Python script that generates a random number sequence with 100000 elements that fails the  $\chi^2$ -test, *i.e.* doesn't show the expected distribution for real random numbers, but does pass the other tests.
- 10.1.5 (1 point) In order to find out, which of the still seemingly real random number sequences is indeed made by a good random number generator, we will investigate the *correlation of triplets* in the sequence:  $C(p, k) = \sum_{i=0}^{N-p} r_i r_{i-p} r_{i-k}$ . For a sequence of truly randomly distributed numbers the triplet correlation evaluates to  $C(p, k) = 1/2^3$ , if  $p$  and  $k$  are different positive integers. Calculate the triplet correlation and the error  $|C(p, k) - 1/2^3|$  for the given data sets with  $p = 250$  and the interval  $k = 1(1)249$ . Make a plot for the deviation of the triplet correlation from the expected value.

**Hint** This seemingly arbitrarily chosen test shows, that even good random number sequences can contain unwanted statistical correlations. One of the data sets was generated by *r250*, which was considered a very reliable and good random number generator. But in 1995 Schmid and Wilding [1] showed that this generator can lead to large errors in certain simulations (see figure 2 in [1]).

## Task 10.2 (5 points): Random Walks

- 10.2.1 (1 points) Write a python script that simulates  $m = 10000$  one-dimensional random walkers. Every random walker jumps randomly for- or backwards a single step per time step.

**Hint** Save the positions of the random walkers in a integer numpy-array: `x = numpy.zeros(m, dtype=int)`. You can also apply the jumps for all random walkers at once (`numpy.random.random_integers`).

- 10.2.2 (2 points) Extend the script from the previous task such that it measures the probability of a walker to return to the starting point (*i.e.* 0) during  $N = 2^i$  with  $i = 0(1)14$  steps (*Rückkehrwahrscheinlichkeit, probability of return*). Generate a semilogarithmic plot (`semilogx`) for the probability of return  $p$  versus the number of steps  $N$ .

**Hint** Some of the following numpy functions might be helpful: `all`, `any`, `logical_and`, `logical_or`, `compress`, `count_nonzero`

- 10.2.3 (2 points) Extend your script further so that it measures the probability of return for random walks in  $d \in \{1, 2, 3, 4\}$  dimensions. Plot the probability of return again in `semilogx` versus the number of steps. Is there any qualitative difference between random walks in different dimensions?

## References

- [1] F. Schmid and N. B. Wilding. Errors in Monte Carlo Simulations Using Shift Register Random Number Generators. *International Journal of Modern Physics C*, 6:781–787, 1995. <http://arxiv.org/abs/cond-mat/9512135>.