



INTERNATIONAL ATOMIC ENERGY AGENCY
UNITED NATIONS EDUCATIONAL, SCIENTIFIC AND CULTURAL ORGANIZATION



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SECOND SCHOOL ON ADVANCED TECHNIQUES
IN COMPUTATIONAL PHYSICS
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SMR.282/ 10

M.C.D. GENERATORS

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EXERCISES M.C.D. GENERATORS

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1.) STUDY OF R.N. GENERATORS

a.) The mid-squares method, proposed by J. von Neuman was apparently the first algorithm proposed for the generation of pseudorandom numbers, and proceeds as follows:

Suppose we wish to generate four-digit integers and the last number generated was ABCD. Let's assume that we are using 8-digit decimals and that in successive steps, we just take the four middle digits as the number we want. To obtain the next number in the sequence, we square the last one and use the middle four digits of the product, i.e.

$$\begin{array}{l} \text{XYABCDZW} \\ \text{squared} = \text{RWEFGDYY} \\ \text{squared} = \text{SVHLMOTP} \\ \text{squared (etc.)} \end{array}$$

Study the statistical quality of this RNG by means of:

a-1) Its dependence upon the "seed" (the first number).

a-2) The repetition cycle (How long before the sequence ABCD is repeated).

b.) The Fibonacci method consists in adding two preceding numbers and taking the remainder when the sum is taken with respect to some modulus i.e.:

$$X_i = (X_{i-1} + X_{i-2}) \bmod m$$

b-1) Write a code to study the quality of this RNG.

b-2) Consider the recursive formula,

$$X_i = (a X_{i-1} + c) \bmod m$$

where a, c and m are parameters which depend upon the particular word-length and determine the statistical quality of the generator. For c=0, the method is called a "pure multiplicative congruential" generator. Write a code to generate RN's using this method. (Hint: use a modulus $m=2^s-1$). Test the quality of the distribution by means of the χ^2 statistic. (Hint: Partition the outcomes in m-subsets: $X^2 < 0.10$, $0.10 < X^2 < 0.2$ etc. and compute the number of occurrences f_i . If we denote the expected frequency as f_i , the computed quantity,

$$\chi^2 = \sum_{i=1}^m \frac{(f_i - f_i)^2}{f_i}$$

should approach the χ^2 distribution for m-1 degrees of freedom. The approximation tends to be reasonable for large numbers of cells (300).

c.) The combination of two pseudorandom sequences X and Y to produce a third Z tends to reduce nonrandomness. Code the algorithms:

a.) set $Z = (X + Y) \bmod m$

b.) use $X = 171 X \bmod 30269$

$Y = 172 Y \bmod 30307$

and compare its quality with that of the preceding one by χ^2 testing.

2.) Make a Gaussian RNG by means of the central-limit theorems in the following way; consider a set of $V_1, \dots, V_n$ random variables and set $N = \sum_{i=1}^n V_i$. As $n \rightarrow \infty$, N tends to be normally-distributed. Since we have to settle for a finite n, a convenient way to obtain N is:

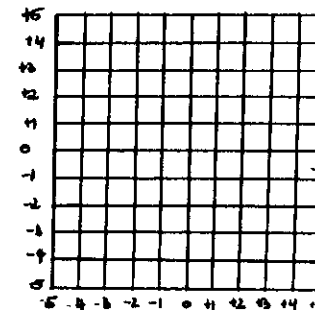
$$N = \sum_{i=1}^{12} V_i - 6$$

where the V_i are uniformly-generated pseudorandom numbers. Code the above equation and compute the expectation value and variance of the obtained distribution.

3.) Study the properties of the distribution obtained by dividing two independent Gaussian-distributed variables X, Y, (i.e. $Z = X/Y$). Compute the expectation and variance of Z numerically. Take X and Y = N(1,1).

4.) 2D RANDOM WALK

Consider a planar square lattice like:



Suppose you are initially located at the lattice point (0,0). A "random walk" is simulated if at each lattice point a random choice is made about the direction of your next step.

a.) Code an algorithm to perform such a walk starting from an arbitrary point.

b.) Suppose that every time you reach the boundaries you get reflected (unable to leave the lattice) unless you are (-2,5) or (4,5). Compute the number of steps required to exit (try at least 10 simulations).

c.) Self-avoiding-walk.

Suppose that at each lattice point the random choice is subject to the restrictions that:

- a.) you will never visit a lattice point more than once.
- b.) all the boundaries are closed.

Write a program to simulate such a movement, bearing in mind that the simulation will stop by either achieving a maximum number of steps (200) or by getting stuck into a point (unable to move without violating the constraints a & b).

5.) BRUTE FORCE INTEGRATION

Compute the value of the definite integral,

$$I = \int_0^1 2x^2 dx$$

by means of a program which determines the area under the function $f(x) = 2x^2$. The way to proceed would be to generate random numbers and check if the associated point lays below $f(x)$ (i.e. P is below $f(x)$ $0 < X < 1$)
Generate at least 5000 events $0 < Y < 2$.

6.) Code the Adaptive Integration algorithm given in the lectures (use the scheme, the abscissas and weights given separately).

ADAPTIVE QUADRATURE.

A GOOD ALGORITHM:

R65 ON ONE INTERVAL, USE R65:
 $G_n =$ GAUSS RULE with n points
 $I = G_6$
 $\Delta = |G_6 - G_5|$

THEN:

1. APPLY R65 TO TOTAL INTERVAL
2. IF Δ TOO BIG GO TO 3
ELSE FINISHED
3. DIVIDE IN HALVES THE INTERVAL WITH THE LARGEST Δ
4. APPLY R65 TO BOTH HALVES
5. SET $I = \sum_{\text{ALL INTERVALS}} I_i$
- $\Delta = \sum \Delta_i$
6. GO TO 2

Table 25.4 ABSCISSAS AND WEIGHT FACTORS FOR GAUSSIAN INTEGRATION

$$\int_{-1}^{+1} f(x) dx = \sum_{i=1}^n w_i f(x_i)$$

Abcissas = x_i (Zeros of Legendre Polynomials)			Weight Factors = w_i		
n	x_i	w_i	n	x_i	w_i
$n=2$	0.57735 02691 89426	1.00000 00000 00000	$n=8$	0.18343 44424 95650	0.34240 37833 78362
$n=3$	0.00000 00000 00000	0.88888 88888 88889		0.52553 24099 16329	0.31370 66458 77087
	0.77459 66692 41483	0.55555 55555 55556		0.79666 64774 13627	0.22228 10346 53374
$n=4$	0.33998 10435 84856	0.65214 51540 62546	$n=9$	0.00000 00000 00000	0.31023 93550 01240
	0.86113 63115 94053	0.34785 40451 37454		0.32425 34234 03809	0.31234 70770 40003
$n=5$	0.00000 00000 00000	0.56888 88888 88889		0.61337 14327 00590	0.26061 06964 02935
	0.53846 93101 05683	0.47862 88704 99366		0.81603 11073 26636	0.18064 81606 94857
	0.90617 98459 38664	0.23692 68850 56189		0.96816 02395 07626	0.08127 43883 61574
$n=6$	0.23861 91860 83197	0.46791 39345 72691	$n=10$	0.14887 43389 81631	0.29552 42247 14753
	0.66120 93864 66265	0.36070 15730 48139		0.43339 53941 29247	0.26928 67193 09996
	0.93246 95142 03152	0.17132 44923 79170		0.67940 95682 99024	0.21908 63625 15982
$n=7$	0.00000 00000 00000	0.41795 91836 73469	$n=12$	0.07390 65285 17172	0.06667 13443 08668
	0.40584 51513 77397	0.38183 00505 05119		0.12523 34085 11469	0.24914 70458 13403
	0.74153 11855 99394	0.27970 59914 89277		0.36783 14989 98180	0.22349 25365 38355
	0.94910 79123 42759	0.12948 49661 68870		0.58731 79542 86617	0.20316 74267 23066
				0.76990 26741 94305	0.16007 83285 43346
				0.90411 72563 70475	0.10697 93259 95378
				0.98156 06342 46719	0.04717 53363 86512
$n=16$					
	0.09501 25098 37637 440185	0.18945 06104 55068 486285		0.24914 70458 13403	
	0.28160 35507 79258 913330	0.18260 34150 44923 588867		0.22349 25365 38355	
	0.45801 67776 57272 386342	0.14915 65193 95002 518189		0.20316 74267 23066	
	0.61787 62444 02643 748447	0.11691 65193 95002 518189		0.16007 83285 43346	
	0.75440 44083 55003 033895	0.11495 59888 16576 732081		0.10697 93259 95378	
	0.86563 12023 87831 743880	0.12462 89712 55353 872052			
	0.94457 50230 73232 576078	0.09515 85116 82492 784810			
	0.98940 09349 91649 932596	0.06225 35239 38647 892863			
		0.02715 24594 11754 094852			
$n=20$					
	0.07652 65211 33497 333755	0.15375 33871 30725 850698			
	0.22778 58511 41645 078080	0.14917 29864 72603 746768			
	0.37370 60867 15419 560673	0.14209 61093 18382 051329			
	0.51086 70019 50827 098004	0.13168 86384 49176 626898			
	0.63605 36807 26515 025453	0.11819 45319 61518 417312			
	0.74633 19064 60150 792614	0.10193 01198 17240 435037			
	0.83911 69718 22218 823395	0.08327 67415 76704 748725			
	0.91223 44282 51325 905868	0.06267 20485 34109 063570			
	0.96397 19272 77913 791268	0.04060 14298 00386 941331			
	0.99312 85991 85094 924786	0.01761 40071 39152 118312			
$n=24$					
	0.06405 68928 62605 626085	0.12793 81953 46752 156974			
	0.19111 88674 73616 309159	0.12583 74563 46828 286121			
	0.31504 26796 96163 374387	0.12167 04729 27803 391204			
	0.43379 35076 26045 138487	0.11350 56680 53725 641353			
	0.54542 14713 88839 535658	0.10744 42701 15965 634783			
	0.64809 36519 36975 569252	0.09761 86521 04113 888270			
	0.74012 41915 78554 364244	0.08619 01615 31953 275917			
	0.82000 19859 73902 921954	0.07334 64814 11080 305734			
	0.88641 55270 04401 034213	0.05929 85849 15436 780746			
	0.93827 45520 02732 758524	0.04427 74388 17419 806169			
	0.97472 85559 71309 498198	0.02853 13886 28933 663181			
	0.99518 72199 97021 360180	0.01234 12297 99987 199547			

Compiled from P. Davis and P. Rabinowitz, *Abcissas and weights for Gaussian quadratures of high order*, J. Research NBS 56, 35-37, 1956, RP2645; P. Davis and P. Rabinowitz, *Additional abscissas and weights for Gaussian quadratures of high order*. Values for $n=64, 80$, and 96 , J. Research NBS 60, 613-614, 1958, RP2875; and A. N. Lowan, N. David, and A. Levenson, *Table of the zeros of the Legendre polynomials of order 1-16 and the weight coefficients for Gauss' mechanical quadrature formula*, Bull. Amer. Math. Soc. 48, 739-743, 1942 (with permission).