

Random variables

Note

- ▶ there is no chapter in the textbook that corresponds to this topic

Computing random numbers

- ▶ the ability to quickly generate random numbers has many very useful applications
 - ▶ Monte Carlo methods
 - ▶ Monte Carlo simulations
 - ▶ statistical sampling
 - ▶ cryptography
 - ▶ games of chance
- ▶ there are two broad classes of methods for generating random numbers on a computer
 - ▶ hardware random number generator
 - ▶ pseudo random number generator

Hardware random number generators

- ▶ often called true random number generators
- ▶ generate random numbers by measuring some sort of physical process that is statistically random
 - ▶ thermal noise is probably the most common source in commodity hardware
- ▶ called true random number generators because the stream of random numbers is more or less impossible to predict or reproduce

Pseudo random numbers

- ▶ often called deterministic random number generators
- ▶ a computer algorithm that generates a sequence of numbers that is approximately random
 - ▶ the period of the sequence is very long
 - ▶ numbers are uniformly distributed
 - ▶ difficult to predict the next number in the sequence
- ▶ called deterministic because if you know the seed value used to initialize the generator then you can reproduce the sequence of random numbers
 - ▶ this is useful for double checking your results

Uniformly distributed random numbers

- ▶ in a *discrete uniform distribution* all numbers in the set of values occur with equal probability, e.g.,
 - ▶ fair coin: heads, tails
 - ▶ fair die: 1, 2, 3, 4, 5, 6
 - ▶ fairly shuffled deck of playing cards

MATLAB Uniform RNGs

- ▶ MATLAB provides three uniform RNG functions
 - ▶ **rand**
 - ▶ floating-point random numbers strictly between 0 and 1
 - ▶ **randi**
 - ▶ integer random numbers from 1 to some user-specified value
 - ▶ **randperm**
 - ▶ random permutation of the integers from 1 to some user-specified value
- ▶ try the functions to see what they do
 - ▶ draw a histogram for **rand** and **randi**

Simulating two dice

```
function [total, v1, v2] = roll( )
%ROLL Rolls two six-sided dice
% [TOTAL, V1, V2] = ROLL() simulates the rolling of two six-sided
% dice. The sum of the two dice are returned in TOTAL, the value
% of the first die is returned in V1, and the value of second
% die is returned in V2.

v1 = randi(6, [1 1]);
v2 = randi(6, [1 1]);
total = v1 + v2;

end
```


Simulating two dice

- ▶ what is the most likely total value?
 - ▶ roll the dice many times and draw a histogram of the result
- ▶ what are the odds of rolling a total of 2? 3? 4? ...
 - ▶ roll the dice many times and count the number of 2s, 3s, 4s, ...

2D random walk

- ▶ a 2D random walk is similar to a 1D random walk except it occurs in 2D
- ▶ the walk begins at a point (usually the origin)
- ▶ each step of the walk is randomly one step:
 - ▶ left,
 - ▶ right,
 - ▶ up, or
 - ▶ down

```

function [p, seq] = walk2(n)
%WALK2 2d random walk
% [P, SEQ] = WALK2(N) performs an N-step 2D random walk starting from
% the origin. The final position of the walk is returned in P.
% The sequence of positions along the walk are returned in SEQ.

seq = zeros(2, n);
for idx = 2:n
    direction = randi(4, [1 1]);
    if direction == 1
        seq(:, idx) = seq(:, idx - 1) + [0; 1]; % up
    elseif direction == 2
        seq(:, idx) = seq(:, idx - 1) + [0; -1]; % down
    elseif direction == 3
        seq(:, idx) = seq(:, idx - 1) + [-1; 0]; % left
    else
        seq(:, idx) = seq(:, idx - 1) + [1; 0]; % right
    end
end
p = seq(:, end);

end

```

2D random walk

- ▶ what is the most likely final position of the random walker?
 - ▶ run the random walk many times and histogram the results

```
P = zeros(2, 1000000);  
for idx = 1:10000  
    I = 100*(idx - 1) + 1;  
    [p, P(:, I:(I+99))] = walk2(100);  
end  
hist3(P', {-20:20, -20:20})
```

Additive Gaussian noise model

- ▶ the most common simple noise model is the additive Gaussian noise model
 - ▶ measured value = true value + gaussian noise
- ▶ the Gaussian distribution is another name for the normal distribution (bell curve)
- ▶ if we want to simulate performing a measurement with additive Gaussian noise then we need a way to draw a random number from a normal distribution

MATLAB normally distributed random numbers

- ▶ MATLAB provides one RNG for one-dimensional normally distributed values
 - ▶ **randn**
 - ▶ floating-point random numbers drawn from the standard normal distribution (mean = 0, standard deviation = 1)
- ▶ if you want a standard deviation of s then multiply the result by s
- ▶ try the function to see what it does
 - ▶ draw a histogram