Introduction to Stochastic Models

Deterministic Models

So far, we have been studying idealized, <u>deterministic</u> models where the outcome is always <u>certain</u>.

Stochastic Models

Now, we study models which account for <u>random</u> or <u>chance</u> factors. These factors are unpredictable, unknown events which have an effect on the process we are studying.

Stochastic Model

Definition:

A *stochastic model* is a mathematical model that describes processes (such as biological processes) that are driven by chance (random) events.

Example: Lion Population with Immigration

Suppose that a population p_t of lions at time t is described by the stochastic dynamical system

$$p_{t+1} = p_t + I_t$$

where the term I_t represents *possible* immigration of lions and where time t=0,1,2,... is measured in years.

Example: Lion Population with Immigration

Suppose that initially there are 160 lions and that the immigration term is defined as

 $I_t = \begin{cases} 12 & \text{with } 50\% \text{ chance} \\ 0 & \text{with } 50\% \text{ chance} \end{cases}$

Analyze *possible* dynamics of this population over the next three years.

Example: Lion Population with Immigration

Trials/simulations:

| t | l _t | p _t |
|---|----------------|----------------|
| 0 | | 160 |
| 1 | | |
| 2 | | |
| 3 | | |

| t | l _t | p _t |
|---|----------------|----------------|
| 0 | | 160 |
| 1 | | |
| 2 | | |
| 3 | | |

```
# lion population with immigration; multiple simulations
                                                                                     numyears = 3
# lion population with immigration (It = 12 with a 50% chance; It=0 with a 50% chance)
                                                                                      numsims = 10
                                                                                     pt end = [] # population size after numyears
numyears = 3
pt = 160 # initial population
                                                                                     for simulation in range(0, numsims):
                                                                                          pt = 160
for i in range(0,numyears):
                                                                                          for i in range(0,numyears):
   a = ra.randrange(1,3) # generates a random integer between 1 and 2, so, either 1 or 2
                                                                                              a = ra.randrange(1,3)
    if a == 1.:
                                                                                              if a == 1.:
       It = 0
                                                                                                   It = 0
    if a == 2.:
       It = 12
                                                                                              if a == 2.:
    pt = pt + It
                                                                                                   It = 12
   print("year:", i+1, "population:", pt)
                                                                                              pt = pt + It
                                                                                          pt end.append(pt)
print("The lion population size after", numyears, "years is", pt)
year: 1 population: 172
                                                                                     print('Final population sizes:', pt end)
year: 2 population: 184
                                                                                     print('Largest population size is', max(pt end))
year: 3 population: 196
                                                                                      print('Smallest population size is', min(pt end))
The lion population size after 3 years is 196
                                                                                     Final population sizes: [184, 172, 172, 184, 160, 172, 196, 160, 184, 184]
                                                                                     Largest population size is 196
```

Smallest population size is 160

Random Experiment and Sample Space

Definition:

A *random experiment* is an experiment that is repeatable but has an uncertain outcome.

The set of all possible outcomes of a random experiment is called the *sample space* of that experiment.

Example: Lion Population with Immigration

Sample Space:

At the end of 3 years, what are the possible sizes of the lion population? Do all occur with equal likelihood?

Expectations:

What is your prediction for the population of lions in the next 3 years?

```
# lion population with immigration; counting frequency
 numvears = 30
 numsims = 5000
 pt_end = []
 for simulation in range(0, numsims):
      pt = 160
      for i in range(0, numyears):
          a = ra.randrange(1,3)
          if a == 1.:
              Tt = 0
          if a == 2.:
              It = 12
          pt = pt + It
      pt_end.append(pt)
 # recording frequency of events
 size = []
 frequency = []
 for j in range(0, len(pt end)):
     freg = 0
      for k in range(0, len(pt_end)):
          if pt end[j] == pt end[k] :
              freq = freq + 1
      size.append(pt_end[j])
      frequency.append(freq)
 # plot
 plt.scatter(size, frequency)
 plt.xlabel("final population size")
 plt.ylabel("frequency")
```



plt.grid()
plt.show()

Sample Spaces and Events

Definition: Simple Event and Event

A single outcome of a random experiment is called a *simple event*. An *event* is a collection (or set) of simple events.

Statistic

Definition:

A *statistic* is a set of numerical values that can summarize the outcomes of a random experiment.

Stochastic Models

Example #6.

A population of leopards p_t is modelled by

$$p_{t+1} = p_t + I_t$$
 where $I_t = \begin{cases} 10 & \text{with a 90\% chance} \\ -100 & \text{with a 10\% chance} \end{cases}$

What is more likely to happen to the number of leopards over time – a net increase or decrease? Or will the population remain at about the same size? Explain.