

## HW7 - Do not Post

2) A) The following linear homogeneous recurrence:

$$x_N(i) = \frac{1}{2}(x_N(i-1) + x_N(i+1))$$

is true because the game is played with a fair coin, meaning that there is a 0.5 chance of gaining a dollar ( $x_N(i+1)$ ) or losing a dollar ( $x_N(i-1)$ ).

The probabilities are added because they are independent events. The boundary conditions

$$x_N(0) = 0, x_N(N) = 1$$

are true because if you enter the game with nothing, you have nothing to bet, therefore you never leave a winner. If you enter the game with the max capital, then you've won, so you will always exit the game as a winner.

B)  $x_A(0) = 0 \quad x_A(N) = 1$

$$y_N(0) = \frac{0}{N} = 0 \checkmark \quad y_N(N) = \frac{N}{N} = 1 \checkmark$$

Suppose  $x_A(N) = \frac{i}{N}$

$$y_N(i) = \frac{i}{N} = x_A(N) = \frac{1}{2}(x_A(i-1) + x_A(i+1))$$

$$\frac{i}{N} = \frac{1}{2}\left(\frac{i-1}{N} + \frac{i+1}{N}\right)$$

$$\frac{i}{N} = \frac{1}{2}\left(\frac{2i}{N}\right)$$

$$\frac{i}{N} = \frac{i}{N} \checkmark$$

The explicit formula  $\frac{i}{N}$  exists in this situation because there is an equal probability of losing or gaining a dollar because of the fair coin.

c) The linear inhomogeneous recurrence:

$$E_N(i) = \frac{1}{2} [E_N(i-1) + E_N(i+1)] + 1$$

is an accurate representation of the expected number of rounds to complete a Gambler's Ruin game because, like in the previous problem, with the fair coin there is an equal chance of gaining a dollar and getting to the max capital or losing a dollar and leaving a loser. Again, these are independent probabilities, so they're added together. The addition of the 1 at the end counts entering the casino to bet.

①  $E_N(0) = 0(N-0) = 0 \checkmark$

$$E_N(N) = N(N-N) = 0 \checkmark$$

\* Suppose  $E_N = i(N-i)$

$$i(N-i) = \frac{1}{2} (E_N(i-1) + E_N(i+1)) + 1$$

$$i(N-i) = \frac{1}{2} ((i-1)(N-i+1) + (i+1)(N-i-1)) + 1$$

$$i(N-i) = \frac{1}{2} (Ni - i^2 + i - N + i - 1 + Ni - i^2 - i + N - i - 1) + 1$$

$$i(N-i) = \frac{1}{2} (2Ni - 2i^2 - 2) + 1$$

$$i(N-i) = Ni - i^2 - 1 + 1$$

$$i(N-i) = i(N-i) \checkmark$$

This explicit formula  $i(N-i)$  exists to characterize the average number of rounds to exit Gambler's Ruin only because the probability of gaining enough to win or losing all the money is exactly the same.

> #Do not post  
#Nikita John, September 27th, 2021, Assignment 7  
#Maple Code for Dr. Z.'s Dynamcial Methods in Biology, Lecture 7

```
Help7 :=proc( ) :
print(`GR(p,i,N), GRt(p,i,N), GRm(N,p), OneStepMarkov(P,i), MarkovTrip(P,K), StSa(P,K)
, StS(P), StSp(P,K), RandSM(N)`):end:

with(Statistics):
with(LinearAlgebra):
```

#GR(p,i,N): Simulating a Gambler's Ruin problem. You enter a casino with  $i$  dollars. At every round you win a dollar with prob.  $p$  and lose a

```
#dollar with prob.  $1-p$ . You exit as soon as you are broke or got the maximum allowed that is N. It returns [0,c] or [1,c]
#if you lost or won respectively, where c is the number of rounds. Try: GR(3/5,5,10);
GR :=proc( p, i, N ) local X, x, d, c :
X := RandomVariable(Bernoulli(p)) :
c := 0 :
x := i :
print(`I enter the casino with `, i, `dollars `) :
while x > 0 and x < N do
c := c + 1 :
d := trunc(Sample(X, 1)[1]) :
if d=0 then
x := x-1 :
print(`I lost a dollar, now I have`, x, `dollars `) :
else
x := x + 1 :
print(`I lost a dollar, now I have`, x, `dollars `) :
fi:
od:
if x=0 then
print(`I am so sad, I am broke`) :
print(`It took`, c, `rounds `) :
RETURN([0, c]) :
elif x=N then
print(`Yea, I am rich, I now have the max`, N) :
print(`It took`, c, `rounds `) :
RETURN([1, c]) :
fi:
end:
```

#GRt(p,i,N): A terse version of GR(p,i,N). Returns [0,c] or [1,c], where c is the number of rounds
GRt :=proc( p, i, N ) local X, x, d, c :
X := RandomVariable(Bernoulli(p)) :

```

 $c := 0 :$ 
 $x := i :$ 
while  $x > 0$  and  $x < N$  do
   $c := c + 1 :$ 
   $d := \text{trunc}(\text{Sample}(X, 1)[1]) :$ 
  if  $d = 0$  then
     $x := x - 1 :$ 
  else
     $x := x + 1 :$ 
  fi:
od:
if  $x = 0$  then
   $\text{RETURN}([0, c]) :$ 
elif  $x = N$  then
   $\text{RETURN}([1, c]) :$ 
fi:
end:

```

#GRm( $N, p$ ): The  $(N+1) \times (N+1)$  Transition matrix for a Gambler's ruin with max. capital  $N$   
 $\text{GRm} := \text{proc}(N, p) \text{ local } i :$

```

[
[1, 0$N],
seq([0$(i-1), (1-p), 0, p, 0$(N-1-i)], i=1 .. N-1),
[0$N, 1]
]:
end:

```

##OneStepMarkov( $P, i$ ): Suppose that there are  $n$  sites, let  $P$  be an  $n$  by  $n$  transition matrix  
given as a list of length  $n$   
#where  $P[i][j]$  is the probability of getting from site  $i$  to site  $j$ . Outputs the state visited next

```

 $\text{OneStepMarkov} := \text{proc}(P, i)$ 
 $\text{trunc}(\text{Sample}(\text{RandomVariable}(\text{ProbabilityTable}(P[i])), 1)[1]) :$ 
end:

```

#MarkovTrip( $P, K$ ): The trajectory of a Markov chain with transition matrix  $P$  with  $K$  steps  
#Try: MakovTrip([[0.2, 0.8], [0.4, 0.6]], 1000);  
 $\text{MarkovTrip} := \text{proc}(P, K) \text{ local } x, L, i :$

```

 $x := 1 :$ 
 $L := [1] :$ 

for  $i$  from 1 to  $K$  do
   $x := \text{OneStepMarkov}(P, x) :$ 
   $L := [\text{op}(L), x] :$ 
od:

```

*L* :

**end:**

#*StSa(P,K)*: Given a transition matrix, ESTIMATES the steady-state probability distribution of the Markov chain using a walk with *K* steps

*StSa* :=**proc**(*P, K*) **local** *L, x, f, i* :

*L* := *MarkovTrip(P, K)* :

*f* := *add(x[L[i]], i = 1 ..K)* :

*evalf([seq(coeff(f, x[i], 1) / K, i = 1 ..nops(P))])* :

**end:**

#*StS(P,K)*: Given a transition matrix, FIND the EXACT steady-state probability distribution of the Markov chain using linear algebra

*StS* :=**proc**(*P*) **local** *x, n, eq, var, i, j* :

*n* := *nops(P)* :

*var* := {*seq(x[i], i = 1 ..n)*} :

*eq* := {*seq(add(x[i]\*P[i][j], i = 1 ..n) = x[j], j = 1 ..n), add(x[i], i = 1 ..n) = 1*} :

*subs(solve(eq, var), [seq(x[i], i = 1 ..n)])* :

**end:**

#*StSp(P,K)*: Given a transition matrix, FIND the approximate steady-state probability distribution using raising the matrix to the *K*-th power

*StSp* :=**proc**(*P, K*) **local** *Q, i* :

*Q* := *evalm(P^K)* :

[*seq(Q[i, 1], i = 1 ..nops(P))*] :

**end:**

#*RandPV(N)*: A random stochastic vector of length *N*

*RandPV* :=**proc**(*N*) **local** *ra, i, v, s* :

*ra* := *rand(1..1000)* :

*v* := [*seq(ra(), i = 1 ..N)*] :

*s* := *add(v[i], i = 1 ..N)* :

*v/s* :

**end:**

#Added after class

#*RandSM(N)*: A random *N* by *N* stochastic matrix

*RandSM* :=**proc**(*N*) **local** *i* :

[*seq(RandPV(N), i = 1 ..N)*] :

**end:**

> #1: *EstGR* computes  $GR$   $K$  times and gives win probability and average rounds it takes

```
EstGR :=proc(p, i, N, K) local X, x, d, c, Win, Loss, roundNum, inc, storeC :  
X := RandomVariable(Bernoulli(p)) :  
c := 0 :  
x := i :  
inc := 1;  
Win := 0 :  
Loss := 0 :  
storeC := 0 :  
while inc ≤ K do  
while x > 0 and x < N do  
c := c + 1 :  
d := trunc(Sample(X, 1)[1]) :  
if d = 0 then  
x := x - 1 :  
else  
x := x + 1 :  
fi:  
od:  
if x = 0 then  
Loss := Loss + 1 :  
elif x = N then  
Win := Win + 1 :  
fi:  
if inc = 1 then  
storeC := c :  
else  
storeC := storeC + c :  
fi:  
inc := inc + 1 :  
od:  
RETURN( [  $\frac{Win}{K}$ ,  $\frac{storeC}{K}$  ] ) :  
end:
```

> #3: *Coding ExactFair*

```
ExactFairGR :=proc(i, N) local X, c :  
X :=  $\frac{i}{N}$  :  
c := i · (N - i) :  
RETURN( [X, c] ) :  
end:  
#i = 1
```

#Note: I inferred that *ExactFairGR* and *EstGR* should yield the same answer, however for some reason it wasn't working. I assume that it's a problem with my *EstGR* code, however formulaically it makes sense to me so I'm not sure how to improve it. Any suggestions would be greatly appreciated!

$$\begin{aligned}
 & ExactFairGR(1, 20); \\
 & EstGR\left(\frac{1}{2}, 1, 20, 3000\right); \\
 & \quad \left[ \frac{1}{20}, 19 \right] \\
 & \quad [0, 1]
 \end{aligned} \tag{1}$$

> # $i = 2$

$$\begin{aligned}
 & ExactFairGR(2, 20); \\
 & EstGR\left(\frac{1}{2}, 2, 20, 3000\right); \\
 & \quad \left[ \frac{1}{10}, 36 \right] \\
 & \quad [0, 4]
 \end{aligned} \tag{2}$$

> # $i = 3$

$$\begin{aligned}
 & ExactFairGR(3, 20); \\
 & EstGR\left(\frac{1}{2}, 3, 20, 3000\right); \\
 & \quad \left[ \frac{3}{20}, 51 \right] \\
 & \quad [1, 71]
 \end{aligned} \tag{3}$$

> # $i = 4$

$$\begin{aligned}
 & ExactFairGR(4, 20); \\
 & EstGR\left(\frac{1}{2}, 4, 20, 3000\right); \\
 & \quad \left[ \frac{1}{5}, 64 \right] \\
 & \quad [0, 108]
 \end{aligned} \tag{4}$$

> # $i = 5$

$$\begin{aligned}
 & ExactFairGR(5, 20); \\
 & EstGR\left(\frac{1}{2}, 5, 20, 3000\right); \\
 & \quad \left[ \frac{1}{4}, 75 \right] \\
 & \quad [0, 49]
 \end{aligned} \tag{5}$$

> # $i = 6$

$$\begin{aligned}
 & ExactFairGR(6, 20); \\
 & EstGR\left(\frac{1}{2}, 6, 20, 3000\right); \\
 & \quad \left[ \frac{3}{10}, 84 \right] \\
 & \quad [0, 72]
 \end{aligned} \tag{6}$$

- > # $i = 7$   
 $ExactFairGR(7, 20);$   
 $EstGR\left(\frac{1}{2}, 7, 20, 3000\right);$ 

$$\left[ \frac{7}{20}, 91 \right]$$

$$[0, 29]$$
(7)
  
- > # $i = 8$   
 $ExactFairGR(8, 20);$   
 $EstGR\left(\frac{1}{2}, 8, 20, 3000\right);$ 

$$\left[ \frac{2}{5}, 96 \right]$$

$$[1, 138]$$
(8)
  
- > # $i = 9$   
 $ExactFairGR(9, 20);$   
 $EstGR\left(\frac{1}{2}, 9, 20, 3000\right);$ 

$$\left[ \frac{9}{20}, 99 \right]$$

$$[1, 169]$$
(9)
  
- > # $i = 10$   
 $ExactFairGR(10, 20);$   
 $EstGR\left(\frac{1}{2}, 10, 20, 3000\right);$ 

$$\left[ \frac{1}{2}, 100 \right]$$

$$[0, 44]$$
(10)
  
- > # $i = 11$   
 $ExactFairGR(11, 20);$   
 $EstGR\left(\frac{1}{2}, 11, 20, 3000\right);$ 

$$\left[ \frac{11}{20}, 99 \right]$$

$$[0, 29]$$
(11)
  
- > # $i = 12$   
 $ExactFairGR(12, 20);$   
 $EstGR\left(\frac{1}{2}, 12, 20, 3000\right);$ 

$$\left[ \frac{3}{5}, 96 \right]$$

[0, 36] (12)

> # $i = 13$   
 $ExactFairGR(13, 20);$   
 $EstGR\left(\frac{1}{2}, 13, 20, 3000\right);$

$\left[\frac{13}{20}, 91\right]$   
[0, 35] (13)

> # $i = 14$   
 $ExactFairGR(14, 20);$   
 $EstGR\left(\frac{1}{2}, 14, 20, 3000\right);$

$\left[\frac{7}{10}, 84\right]$   
[1, 26] (14)

> # $i = 15$   
 $ExactFairGR(15, 20);$   
 $EstGR\left(\frac{1}{2}, 15, 20, 3000\right);$

$\left[\frac{3}{4}, 75\right]$   
[0, 21] (15)

> # $i = 16$   
 $ExactFairGR(16, 20);$   
 $EstGR\left(\frac{1}{2}, 16, 20, 3000\right);$

$\left[\frac{4}{5}, 64\right]$   
[1, 158] (16)

> # $i = 17$   
 $ExactFairGR(17, 20);$   
 $EstGR\left(\frac{1}{2}, 17, 20, 3000\right);$

$\left[\frac{17}{20}, 51\right]$   
[1, 158] (17)

> # $i = 18$   
 $ExactFairGR(18, 20);$   
 $EstGR\left(\frac{1}{2}, 18, 20, 3000\right);$

$\left[\frac{9}{10}, 36\right]$

[1, 22]

(18)

```
> #i = 19
ExactFairGR(19, 20);
EstGR( $\left(\frac{1}{2}, 19, 20, 3000\right)$ );
```

$$\left[ \left[ \frac{19}{20}, 19 \right] \atop [1, 1] \right] \quad (19)$$

```
> #4
A := RandSM(10);
A :=  $\left[ \left[ \begin{array}{c} \frac{20}{921}, \frac{110}{921}, \frac{197}{4605}, \frac{283}{4605}, \frac{352}{4605}, \frac{17}{4605}, \frac{248}{1535}, \frac{247}{1535}, \frac{286}{1535}, \frac{763}{4605} \end{array} \right], \left[ \begin{array}{c} \frac{81}{1877}, \\ \frac{137}{1877}, \frac{90}{1877}, \frac{156}{1877}, \frac{171}{3754}, \frac{595}{3754}, \frac{25}{3754}, \frac{301}{1877}, \frac{605}{3754}, \frac{414}{1877} \end{array} \right], \left[ \begin{array}{c} \frac{477}{3356}, \frac{199}{1678}, \\ \frac{25}{1678}, \frac{379}{3356}, \frac{175}{3356}, \frac{2}{839}, \frac{181}{1678}, \frac{87}{1678}, \frac{235}{839}, \frac{393}{3356} \end{array} \right], \left[ \begin{array}{c} \frac{845}{4964}, \frac{11}{292}, \frac{164}{1241}, \\ \frac{897}{4964}, \frac{227}{2482}, \frac{77}{4964}, \frac{311}{2482}, \frac{39}{4964}, \frac{151}{1241}, \frac{583}{4964} \end{array} \right], \left[ \begin{array}{c} \frac{41}{342}, \frac{359}{1881}, \frac{509}{3762}, \frac{239}{3762}, \\ \frac{367}{3762}, \frac{17}{1254}, \frac{565}{3762}, \frac{2}{19}, \frac{1}{198}, \frac{149}{1254} \end{array} \right], \left[ \begin{array}{c} \frac{117}{691}, \frac{173}{2764}, \frac{643}{5528}, \frac{817}{5528}, \frac{177}{5528}, \frac{707}{5528}, \\ \frac{869}{5528}, \frac{357}{2764}, \frac{101}{2764}, \frac{237}{2764} \end{array} \right], \left[ \begin{array}{c} \frac{458}{4411}, \frac{155}{4411}, \frac{482}{4411}, \frac{584}{4411}, \frac{628}{4411}, \frac{751}{4411}, \frac{130}{4411}, \\ \frac{585}{4411}, \frac{31}{401}, \frac{27}{401} \end{array} \right], \left[ \begin{array}{c} \frac{21}{409}, \frac{772}{4499}, \frac{172}{4499}, \frac{71}{409}, \frac{147}{4499}, \frac{266}{4499}, \frac{13}{409}, \frac{64}{409}, \frac{521}{4499}, \\ \frac{762}{4499} \end{array} \right], \left[ \begin{array}{c} \frac{260}{1731}, \frac{85}{577}, \frac{308}{5193}, \frac{256}{5193}, \frac{409}{5193}, \frac{253}{1731}, \frac{280}{1731}, \frac{361}{5193}, \frac{625}{5193}, \frac{10}{577} \end{array} \right], \left[ \begin{array}{c} \frac{786}{3289}, \frac{683}{3289}, \frac{372}{3289}, \frac{183}{3289}, \frac{109}{3289}, \frac{40}{3289}, \frac{17}{3289}, \frac{454}{3289}, \frac{28}{299}, \frac{337}{3289} \end{array} \right] \right] \quad (20)$ 

```

```
> evalf(StSa(A, 4000));
[0.1182500000, 0.1100000000, 0.07825000000, 0.09950000000, 0.06700000000,
0.07175000000, 0.1032500000, 0.1110000000, 0.1257500000, 0.1152500000] \quad (21)
```

```
> evalf(StS(A));
[0.1188198785, 0.1182894109, 0.07789975470, 0.1030479142, 0.06686855912,
0.07244091436, 0.08954665615, 0.1087605099, 0.1242610846, 0.1200653176] \quad (22)
```

```
> evalf(StSp(A, 4000));
[0.1188198785, 0.1188198785, 0.1188198785, 0.1188198785, 0.1188198785, 0.1188198785,
0.1188198785, 0.1188198785, 0.1188198785, 0.1188198785] \quad (23)
```

>