# GRIZZLY BEARS IN YELLOWSTONE NATIONAL PARK 

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#### Abstract

The problem we solved is based on the population of grizzly bears at Yellowstone National Park. Since this population is currently declining, our specific problem centered around a seed group of 52 grizzlies, transported from Yellowstone to another area in the Northwestern United States, similar in climate and availability of proper food. The total land area available for the bears is 1.5 million acres, enough land for 100 bears to thrive. Our problem was to find a harvesting policy to sustain the maximum number of grizzlies on this land.

Using the matrix equation $L x_{i}=x_{i+1}$ we determined the this seed population would exceed the level the land area can maintain after 14 years. At this point we began to implement our harvesting procedures. Assuming the bears would be harvested at random, producing a uniform harvesting rate for each age group, we used the matrix equation $L x-H L x=x$ to solve for a total of 3 percent harvesting yearly after the fourteenth year. Test results confirmed the accuracy of our matrix values.


## HARVESTING A GRIZZLY BEAR POPULATION

One naturally-occurring animal population found in an environment with resource constraints is that of the grizzly bear in Yellowstone National Park. However, the Park's resource constraints have become so great that recently the grizzly population has been declining. For our problem we decided to form a hypothetical seed population from members of the Yellowstone community, and then transplant this seed population in order to give the American grizzly a better chance of survival. The seed population would be taken to a large wilderness area in the Northwestern United States with a climate similar to that of Yellowstone Park. The amount of suitable land would be proportionate to Yellowstone and the amount of berries, nuts, forbs, graminales, and animal prey would also be proportionate. Based on the theory that overpopulation creates stress for the animal. thus causing harmful population decreases[1], the size of the seed-generated population would need to be controlled. Controlling the population would entail harvesting it. By harvest we mean the systematic removal of bears from the population. The population will be controlled even if the selection of bears to be harvested is random. The seed population would be transplanted to an area of 1.5 million acres, an area approximately large enough for 100 bears to live healthy lives. This parameter is based on the theory that the 300 to 350 grizzlies in Yellowstone Park need 4.4 million acres to thrive[2]. This 1.5 million acre assumption was made to clarify the problem.

Using population statistics gathered from a healthy and growing grizzly population in Yellowstone Park (the study was conducted from 1957-69 by J. J. Craighead et al.[3]). we determined a Leslie Matrix to generate the growth of our seed population. The survivorship rates ( $b_{i}$ 's) were determined from a study from Yellowstone National Park. found in Wild Mammals of North America. The reproductive rate for each age class ( $a_{i}$ 's) was determined by using the average reproductive rate of the entire female population as a guideline. See Table 1 and Table 2 for the contents of the Leslie Matrix.

Table 1.

| Age <br> Class | Ai | $B i$ |
| :---: | :---: | ---: |
| $[0,1]$ | 0.0 | 0.6296 |
| $[1,2]$ | 0.0 | .9529 |
| $[2,3]$ | 0.0 | .6790 |
| $[3,4]$ | 0.0 | .9091 |
| $[4,5]$ | 0.1850 | .8200 |
| $[5,6]$ | .2240 | .9756 |
| $[6,7]$ | .2583 | .9500 |
| $[7,8]$ | .2836 | .9737 |
| $[8,9]$ | .3550 | .9730 |
| $[9,10]$ | .5123 | .9444 |
| $[10,11]$ | .7790 | .9706 |
| $[11,12]$ | .7790 | .9344 |
| $[12,13]$ | .7430 | .9032 |
| $[13,14]$ | .5040 | .8571 |
| $[14,15]$ | .4636 | .7917 |
| $[15,16]$ | .3200 | .7368 |
| $[16,17]$ | .2500 | .8571 |
| $[17,18]$ | .2302 | .7500 |
| $[18,19]$ | .1962 | .8889 |
| $[19,20]$ | .1730 | .7500 |
| $[20,21]$ | .0988 | .6667 |
| $[21,22]$ | .0850 | .7500 |
| $[22,23]$ | .0880 | .6667 |
| $[23,24]$ | .0510 | .5000 |
| $[24,25]$ | .0327 | .5000 |
| $[25,26]$ | 0.0 | 0.0 |

The model we used to develop the harvesting process was based on the Leslie Matrix. A Leslie Matrix is designed to generate the population of any future period by multiplying the previous period's population by the reproductive and survivorship rates of each female age class. We divided our population into one year classes, and so, by the laws of the Leslie Matrix, the period of growth is also one year, so,

$$
L x_{i}=x_{i+1}
$$

for any year $i$, a population of $x_{i}$, and the Leslie Matrix $L$.
Starting with the seed population, the Leslie Matrix generated succeeding populations of increasing size. See Table 3 and Fig. 1. This implied that the grizzly population would eventually attain and surpass a limit matrix, called $X_{m} . X_{m}$ is any matrix such that the summation of the values in the column vector $X_{m}$ equals the size of the maximum healthy population which the environment could sustain. After the population exceeds $X_{m}, L x_{i}$ $=x_{i+1} \geq X_{m}$, then we would want to begin harvesting the grizzly to prevent overpopulation. The equation we used to represent harvesting to maintain constant population was

$$
L x-H L x=x
$$

where $L$ is the Leslie Matrix and $H$ is the harvesting matrix. Each $h$ in $H$, is the amount of each class removed from the population. $L x$ is the growth for one year; $H L x$ is the amount of this growing population removed, and $x$ becomes the maximum population, or $x=X_{m}$.
Table 2. Leslie Matrix


Table 3. Twenty generations generated by the Leslie Matrix, without harvesting.

| Female pop. | Total pop. | Year |
| :--- | :--- | :---: |
| 26 | 52 | 0 |
| 31.4772 | 62.9544 | 1 |
| 35.06585812 | 70.13171624 | 2 |
| 38.55309342814 | 77.10618685627 | 3 |
| 40.4178632828 | 80.8357265656 | 4 |
| 41.65177528744 | 83.30355057488 | 5 |
| 42.42875314236 | 84.85750628471 | 6 |
| 43.06005059941 | 86.12010119882 | 7 |
| 43.54340970991 | 87.08681941982 | 8 |
| 43.79455068739 | 87.58910137478 | 9 |
| 44.10615480056 | 88.21230960112 | 10 |
| 44.65898376734 | 89.31796753468 | 11 |
| 45.98606470045 | 91.9721294009 | 12 |
| 47.92605089839 | 95.85210179678 | 13 |
| 50.34491045951 | 100.689820919 | $14^{*}$ |
| 52.67350776302 | 105.3470155261 | 15 |
| 54.81979699157 | 109.6395939831 | 16 |
| 56.57915357924 | 113.1583071585 | 17 |
| 58.15722741936 | 116.3144548387 | 18 |
| 59.60465086233 | 119.2093017247 | 19 |
| 61.05808789868 | 122.1161757974 | 20 |

* pop. $>X_{m}$


Fig. 1

When we used the Leslie Matrix it was restricted to the female population. Based on data gathered at Yellowstone, we assumed that the total population would grow in proportion to the female population. The ratio of male to female bears in the original seed group and the growing seed population would thus be $1: 1$. Even though the number of males and females in each age group at Yellowstone was not even, the totals were very close. After inspecting the data on the total population of the seed group, it was obvious that the bears would reach $X_{m}$, or 100 bears, after the fourteenth year. The problem then became solving for the amount of bears harvested. Because the ratio of males to females was $1: 1$, we assumed that any harvesting would have an equal effect on both sexes and that by harvesting either sex the population would decrease by the same amount. Because this model is designed for harvesting wild bears, we felt that the animals were likely to be caught at random and that the amount of bears taken from any age class would be the same, or $h_{1}=h_{2}=\cdots=h_{26}$. This is our basic model equation for $H$, and reflects our proposed policy of uniform harvesting.

$$
L X_{m}-H L X_{m}=X_{m} \text { reduces to } L X_{m}=(1 /(1-h)) X_{m} .
$$

Hence $1 /(1-h)$ would be an eigenvalue for $L$. Using the characteristic equation $\operatorname{det}(\lambda L$ $-I)=0$, we solved for $\lambda . \lambda=1 /(1-h)$ implies that $h=1-(1 / \lambda)$. Using the characteristic polynomial equation for $\operatorname{det}(\lambda I-L)$ :

$$
\begin{aligned}
p(\lambda)= & \left(\lambda^{26}\right)-.068511773\left(\lambda^{21}\right)-.068022932\left(\lambda^{20}\right)-.076525034\left(\lambda^{19}\right) \\
& -.079819491\left(\lambda^{18}\right)-.097287323\left(\lambda^{17}\right)-.131267839\left(\lambda^{16}\right) \\
& -.1889126\left(\lambda^{15}\right)-.190403296\left(\lambda^{14}\right)-.170598957\left(\lambda^{13}\right) \\
& -.104520631\left(\lambda^{12}\right)-.082403643\left(\lambda^{11}\right)-.045031209\left(\lambda^{10}\right) \\
& -.02592109\left(\lambda^{9}\right)-.020457382\left(\lambda^{8}\right)-.013076906\left(\lambda^{7}\right) \\
& -.010249555\left(\lambda^{6}\right)-.004390127\left(\lambda^{5}\right)-.002458831\left(\lambda^{4}\right) \\
& -.001955215\left(\lambda^{3}\right)-.000755462\left(\lambda^{2}\right)-.000242192(\lambda)=0,
\end{aligned}
$$

we determined the Leslie Matrix's unique positive eigenvalue. We used the quotientdifference method to obtain an approximate $\lambda$ value of $\lambda=0.9728648613429$, which was not very accurate. Using this as a starting point, we substituted various values into $p[\lambda]$ $=0$ until we had $(\lambda=1.0296)$ with an error of 0.0004 . Using $\lambda=1.0296$ we derived $h$ $=1-(1 / \lambda)$, or $h=0.0288$, or approximately 3 percent. We felt a 3 percent harvest would be reasonable in a natural setting. After solving for $\lambda$, we were able to determine the harvest rate for each age class and determine an eigenvector $X_{1}$, see Table 4. This eigenvector generates the proportion of bears in each class after the harvest if the first age class is proportionately equal to 1 .

By multiplying $X_{1}$ by the number of females in the first age class when the population equalled $X$, we were able to determine if the proportions were the same before and after the harvest at $X_{m}$. This proved to be off by a certain amount. We accounted for this error by the fact that $X_{1}$ is a limit value, see Fig. 2. The solution to maintaining the population at around 100 bears after year 14 would be to randomly remove 2.875 percent $\cong 3$ percent of the total population which we would assume is about 3 percent uniformly from each age class.

One way we tested the harvesting model was to test $L X_{1}-H L X_{1}=X_{1}$ to see if it was true, therefore testing the validity of our eigenvalue. We found that values were very close, and therefore assumed that the values of $\lambda$ and $h$ were reasonable. Another way we tested our model was to chart the natural growth of our seed population, see Table 5 , for the program used. When the total population exceeded the limit of 100 , we began harvesting using the equation $L x-H L x=x$, where $x$ represents the current numbers

Table 4. Proportions of age classes with respect to the tirst age class

| Class | Year 0 | Year 15 | Year 30 | Year 45 | Eigenvector X1 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1.0 | 1.0 | 1.0 | 1.0 | 1.0 |
| 2 | 1.0 | .6024 | .6141 | .6115 | .6115 |
| 3 | 1.0 | .5296 | .5696 | .5662 | .5659 |
| 4 | 1.0 | .3263 | .3749 | .3737 | .3732 |
| 5 | 1.0 | .2715 | .3285 | .3301 | .3295 |
| 6 | 1.0 | .2175 | .2585 | .2628 | .2625 |
| 7 | 1.0 | .2150 | .2415 | .2487 | .2487 |
| 8 | 1.0 | .2106 | .2204 | .2289 | .2295 |
| 9 | 1.0 | .2088 | .2078 | .2157 | .2170 |
| 10 | 1.0 | .2069 | .1975 | .2030 | .2051 |
| 11 | 1.0 | .1963 | .1831 | .1856 | .1881 |
| 12 | 1.0 | .1994 | .1755 | .1747 | .1773 |
| 13 | 1.0 | .1904 | .1627 | .1595 | .1609 |
| 14 | 0.0 | .1683 | .1457 | .1402 | .1411 |
| 15 | 0.0 | .1362 | .1230 | .1172 | .1175 |
| 16 | 0.0 | .0262 | .0944 | .0905 | .0903 |
| 17 | 0.0 | .0306 | .0665 | .0651 | $.06+7$ |
| 18 | 0.0 | .0276 | .0524 | .0543 | .0538 |
| 19 | 0.0 | .0304 | .0358 | .0395 | .0465 |
| 20 | 0.0 | .0298 | .0291 | .0338 | .0338 |
| 21 | 0.0 | .0372 | .0213 | .0243 | .0247 |
| 22 | 0.0 | .0186 | $.01+4$ | .0155 | .0160 |
| 23 | 0.0 | .0147 | .0112 | .0112 | .0116 |
| 24 | 0.0 | .0101 | .0076 | .0072 | .0075 |
| 25 | 0.0 | .0052 | .0039 | .0035 | .0037 |
| 26 | 0.0 | .0027 | .0019 | .0017 | .0018 |

Note: figures reflect natural growth rate for years $0,15,30,45$ as they approach the EIGENVECTOR proportions.
of each female age class. From year fourteen, when the population first exceedeed 100 , to year fifty, the population went from 100.7 to 101.6 . The highest it every reached was approximately 105 . See Table 6 . These results led us to believe that the values for the matrix $H$ were quite accurate.

Due to the nature of our problem and our data, there are many possible errors. Many of these errors come from our inability to evaluate and analyze the data collected from our sources. The original data on the Yellowstone grizzlies was only to four significant digits, and the methods used to collect this data were unknown to us. We had to create logical $a_{i}$ 's for our Leslie Matrix and had no real way to test their validity. When we solved for $\lambda$, we found only a limit value and were able to find $\lambda$ to three significant digits with an error of 0.0004 . Our results were also subject to rounding errors because all data was rounded to four decimal places for calculations. When introducing a seed population, we assumed it would have population statistics similar to those at Yellowstone and that when introducing these bears into a new ecosystem they would not significantly change the ecosystem. The fact that we must limit the seed population of the grizzlies to a maximum of 100 means that the numbers for each age class will be relatively low (see Table 7). Therefore, it will be impossible to realistically harvest 3 percent of each age class. The actual figures will range from 0 percent to as high as 100 percent for the upper age classes! With harvesting we allowed for uniform harvesting in all age classes and that removing both males and females would have the same effect on the population. From our research we know that this is a somewhat inaccurate assumption and would lead to a certain amount of error in figuring the harvesting numbers and the post-harvesting population level. Even though our assumptions and data allow for a certain amount of error, the methods of this model provide a reasonable basis for planning population growth and a population harvest system as demonstrated in our harvest projections.


Fig. 2.

Table 5. Program Seedtest

```
1 PRINT
2 PRINT
3 PRINT
4 \text { 4RRINT}
5 PRINT
6 \text { PRINT}
7 PRINT
10 DIM B}(26,26
20 MAT B = ZER
200 B(2, 1) =.6296
201B(3, 2) = .9529
202 B(4,3) =.6790
203 B(5,4) =.9091
204 B(6,5) =.8200
205 B(7.6) =.9756
206 B(8,7) = .9500
207 B(9.8) =.9737
208 B(10,9) =.9730
209 B(11, 10) =.9444
210 B(12, 11) =.9706
211 B(13, 12) =.9394
212 B(14, 13) =.9032
213 B(15,14) =.8571
21+B(16,15) =.7917
215 B(17. 16) =.7368
216 B(18,17) =.8571
217 B(19, 18) =.7500
218 B(20.19) = .8889
219 B(21, 20) =.7500
220 B(22, 21) =.6667
221 B(23,22) =.7500
222 B(24,23) = . }666
223 B(25, 24) =.5000
224 B(26,25) =.5000
349 B(1,5) =. .185
350 B (1,6) =.224
351 B(1,7) =. .2583
352 B(1,8) = . 2836
353 B(1,9)-. 355
354 B(1,10) =.5112
355 B(1,11) =.7790
356 B(1, 12) =.7790
357 B(1,13) = .743
358 B(1,14) = .504
359 B(1, 15) =.4636
360 B(1, 16) =. .32
361 B (1, 17) =.2500
362 B(1, 18) =. .2302
363 B(1, 19) =. . }96
364 B(1,20)=.173
365 B}(1,21)=.098
366 B(1, 22) =.083
367 B(1, 23) -. .088
368 B(1,24) =.051
369 B(1, 25) = .0327
400 DIM S (26,1)
410 MAT S = ZER
411S(1,1)=2
412S(2,1)=2
413S(3,1)=2
```

Table 5. (Continued)

```
414 S(4, 1) = 2
415S(5,1)=2
416S(6. 1) = 2
417 S(7, 1) = 2
418S(8.1) = 2
419 S(9, 1) = 2
420S(10, 1)=2
421 S(11, 1) = 2
422 S(12, 1) =2
4 2 3 S ( 1 3 . 1 ) = 2
800 MAT P = B*S
820 FOR W = 1 TO 26
830 T1 = T1 + S(W,1)
832T2 = T2 + P(W,1)
840 NEXT W
845 IF L = 0 THEN PRINT TI, (2*T1)
850 IF (2*T2) < 100 THEN PRINT T2. (2*T2)
900 IF (2*T2)>= 100 GOTO 1000
905L=L + 1
906 IF L = 51 GOTO 9990
907 IF L = 31 THEN PRINT
908 IF L = 31 THEN PRINT
909 IF L = 31 THEN PRINT
910 IF L = 31 THEN PRINT
911 IF L = 31 THEN PRINT
9 1 2 ~ I F ~ L ~ = ~ T H E N ~ I N P L T T ~ Q ~
9 1 3 \text { IF L = THEN PRINT}
9 1 4 ~ I F ~ L ~ = ~ 3 1 ~ T H E N ~ P R I N T ~
915 IF L = 31 THEN PRINT
916 IF L = 31 THEN PRINT
917 IF L = 31 THEN PRINT
918 IF L = 31 THEN PRINT
919 IF L = 31 THEN PRINT
920 IF L = 31 THEN PRINT
923 MAT S = P
925 Tl = 0
926 T2 = 0
930 GOTO 800
1000 DIM H(26,26)
1010 PRINT T2, (2*T2),'> Xm'
1100 MAT H = ZER
1200 FOR J = 1 TO 26
1300 H(J, J) = .028749029
1400 NEXT J
2000 MAT M = P
2100 MAT N = H * M
2200 MAT O = M - N
2350 FOR V = 1 TO 26
2360 T3 = T3 + O(V,1)
2 3 7 0 ~ N E X T ~ V ~
2371 E = (2*T2) - (2*T3)
2372 PRINT T3, (2*T3).'after harvesting', E
2390 MAT P = O
2395 T3 = 0
2400 GOTO 905
9 9 9 0 ~ P R I N T ~
9 9 9 1 ~ P R I N T
9 9 9 2 ~ P R I N T ~
9 9 9 3 ~ P R I N T
9 9 9 9 ~ E N D
```

Table 6.


Table 6. (Continued)

| 38 | 50.17995397413 | 100.3599079483 | after harvesting | 2.970653301972 |
| :---: | :---: | :---: | :---: | :---: |
|  | 51.75496160255 | 103.5099232051 | $>\mathrm{Xm}$ |  |
|  | 50.26705671054 | 100.5341134211 | after harvesting | 2.97580978401 |
| 39 | 51.84422535008 | 103.6884507002 | $>\mathrm{Xm}$ |  |
|  | 50.353754212 | 100.707508424 | after harvesting | 2.980942276142 |
| 40 | 51.9205802413 | 103.8411604826 | $>\mathrm{Xm}$ |  |
|  | 50.42791397424 | 100.8558279485 | after harvesting | 2.985332534107 |
| 41 | 51.97818845904 | 103.9563769181 | $>\mathrm{Xm}$ |  |
|  | 50.48386601167 | 100.9677320233 | after harvesting | 2.988644894752 |
| 42 | 52.01746145179 | 104.0349229036 | $>\mathrm{Xm}$ |  |
|  | 50.522009944 | 101.044019888 | after harvesting | 2.990903015567 |
| 43 | 52.04346320132 | 104.0869264027 | $>\mathrm{Xm}$ |  |
|  | 50.54726416849 | 101.094528337 | after harvesting | 2.99239806567 |
| 44 | 52.06318485153 | 104.1263697031 | $>\mathrm{Xm}$ |  |
|  | 50.5664188404 | 101.1328376808 | after harvesting | 2.993532022258 |
| 45 | 52.08330099874 | 104.1666019975 | $>\mathrm{Xm}$ |  |
|  | 50.58595666792 | 101.1719133358 | after harvesting | 2.994688661656 |
| 46 | 52.10909740724 | 104.2181948145 | $>\mathrm{Xm}$ |  |
|  | 50.61101145471 | 101.2220229094 | after harvesting | 2.996171905049 |
| 47 | 52.14353802646 | 104.2870760529 | $>\mathrm{Xm}^{\text {m }}$ |  |
|  | 50.64446193957 | 101.2889238792 | after harvesting | 2.998152173773 |
| 48 | 52.18703648501 | 104.37407297 | $>\mathrm{Xm}$ |  |
|  | 50.68670985968 | 101.3734197194 | after harvesting | 3.000653?50666 |
| 49 | 52.23775646824 | 104.4755129365 | $>\mathrm{Xm}$ |  |
|  | 50.73597169264 | 101.4719433853 | after harvesting | 3.003569551201 |
| 50 | 52.29232406008 | 104.5846481202 | $>\mathrm{Xm}$ |  |
|  | 50.7889705192 | 101.5779410384 | after harvesting | 3.00670708176 |
| 51 | 52.34702308237 | 104.6940461648 | $>\mathrm{Xm}$ |  |
|  | 50.84209699772 | 101.6841939954 | after harvesting | 3.009852169316 |

Table 7.

| Age class | Number of bears in <br> each age class |
| :---: | :---: |
| $0-1$ | 10.28584316328 |
| $1-2$ | 5.945030074955 |
| $2-3$ | 5.167011995047 |
| $3-4$ | 3.210371186269 |
| $4-5$ | 2.851561113715 |
| $5-6$ | 2.369621117632 |
| $6-7$ | 2.383560784069 |
| $7-8$ | 2.305685637626 |
| $8-9$ | 2.286038072135 |
| $9-10$ | 2.234056276132 |
| $10-11$ | 2.208965889327 |
| $11-12$ | 2.178864616081 |
| $12-13$ | 2.002787712922 |
| $13-14$ | 1.708041317855 |
| $14-15$ | .3554945760263 |
| $15-16$ | .4470220073698 |
| $16-17$ | .3456457288593 |
| $17-18$ | .436077381522 |
| $18-19$ | .3599502844727 |
| $19-20$ | .3901948876437 |
| $20-21$ | .2999653195293 |
| $21-22$ | .210512503716 |
| $22-23$ | .1621488936911 |
| $23-24$ | .1111044886165 |
| $24-25$ | .05882279151655 |
| $25-26$ | .0303022828748 |
| Note: Total Females | Total Bears |
|  | Year |
| 50.34491045951 100.689820919 | 14 |

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