PES University, Bangalore

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UE20CS312 - Data Analytics - Worksheet 5 Course instructor: Gowri Srinivasa, Professor Dept. of CSE, PES University

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Markov Chains and AB Testing

Prerequisites

- Revise the following concepts
 - Markov Chains
 - Markov Chains with Absorbing states
 - Calculation of eventual probability of aborbtion
 - A/B Testing
- Install the following software
 - pandas
 - numpy

Points

The problems in this worksheet are for a total of 10 points with each problem having a different weightage.

- Problem 1: 2 points
- Problem 2: 4 points
- Problem 3: 4 points

Scenario 2

Its a freezing day in New york, Commisioner Wench has sent a report to Captain Holt that the 99th precinct has much lower reported crimes compared to other precincts. Upon Analysis Captain Holt decides to add feedback unit along with the 4 major units to analyse this descripency. All the units are mentioned below

- 1. Major Crimes
- 2. Traffic
- 3. General crimes

- 4. Feedback
- 5. Theft

The initial probablity of a person going to a particular unit on a particular day is given as follows

Major Crimes	Traffic	General crimes	Feedback	Theft
0.3	0.4	0.1	0.15	0.05

To measure how many people will go to the feedback unit, the personel files of all employees are give to the **Move-o-Tron 99** and it gives us the following matrix which shows us the probability of people moving from one unit to another on a particular day. It is known that the **_ Move-o-Tron 99_** always outputs matices which follow a first order Markov chain.

	Major Crimes	Traffic	General crimes	Feedback	Theft
Major Crimes	0.002	0.666	0.31	0.0	0.022
Traffic	0.466	0.102	0.222	0.0	0.21
General crimes	0.022	0.11	0.502	0.0	0.366
Feedback	0.0	0.0	0.0	1.0	0.0
Theft	0.11	0.122	0.066	0.0	0.702

As the people of New York are smart the will learn where all the units are present and hence the next days (day 1) distribution will be the distribution present at the end of the current day (day 0). Captain holt want to check if the matrix given by the *Move-o-Tron* can be used to model the footfall.

Problem 1 (2 points)

- 1. What technique can be used to model the probability of people going to the correct unit to report thier crime after N days? (0 points)
- 2. Is the chain irreducible? Justify (0.5 point)
- 3. What will be the intital probability of a person going to a particular unit after 1 day, 2 days, 10 days, 1000 days and 1001 days. (1 point)

Hint: Use the Chapman-Kolmogorov relationship

```
# C = A.B
matrix_C = np.dot(matrix_A, matrix_B)

# C = A.(B^4) can be replaced by
matrix_C = matrix_A
for _ in range(4):
    matrix_C = np.dot(matrix_C, matrix_B)
```

4. What can you say about the markov chain from state of intital probability of a person going to a particular unit after 1000 and 1001 days? (0.5 points)

```
# Importing Librarire
%matplotlib inline
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
# encoding the probabilities as a numpy array
trans_array = np.array([
    [0.002, 0.666, 0.31, 0, 0.022],
    [0.466, 0.102, 0.222, 0, 0.21],
   [0.022, 0.11, 0.502, 0, 0.366],
   [0, 0, 0, 1, 0],
   [0.11, 0.122, 0.066, 0, 0.702]
1)
# ensures that the probabilities sum to 1
assert(trans_array[0].sum() == 1.0)
assert(trans array[1].sum() == 1.0)
assert(trans_array[2].sum() == 1.0)
assert(trans_array[3].sum() == 1.0)
assert(trans_array[4].sum() == 1.0)
# encoding the initial probability of as a numpy array
state = np.array([[0.3, 0.4, 0.1, 0.15, 0.05]])
assert(state[0].sum() == 1.0)
```

After analysing the model Captain holt calls the squad and educates them to ask people to give feedbacks. And the details of the squad are given to the *Move-o-Tron 99*. After reanalyising the report the *Move-o-Tron 99* gave out a new Matrix, which is shown below

	Major Crimes	Traffic	General crimes	Feedback	Theft
Major Crimes	0.002	0.666	0.01	0.02	0.302
Traffic	0.466	0.102	0.02	0.032	0.38
General crimes	0.0	0.0	1.0	0.0	0.0
Feedback	0.0	0.0	0.0	1.0	0.0
Theft	0.11	0.122	0.066	0.004	0.698

Considering the new report the model has to be re-evaluated. The initial probablity of a person going to a particular unit on a particular day remains the same.

Problem 2 (4 points)

- 1. Is the chain irreducible? Justify (0.5 point)
- 2. What will be the intital probability of a person going to a particular unit after 1 day, 2 days, 10 days, 1000 days and 1001 days. (1 point)

Hint: Use the Chapman-Kolmogorov relationship

- 3. What can you say about the markov chain from state of intital probability of a person going to a particular unit after 1000 and 1001 days? (0.5 points)
- 4. Summer Edgecombe is Confidential Informant (CI) to the Officer Kimbal Cho and comes in every day to the police station. If on the first day she goes to the Major crimes Unit what will be the probability that she gives a feedback? (2 points)

```
# np.delete()
# https://note.nkmk.me/en/python-numpy-delete/#:~:text=Using%20the%20NumPy%20function%20np,f
print(a)
# [[ 0 1 2 3]
# [ 4 5 6 7]
# [8 9 10 11]]
print(np.delete(a, 1, 0))
# [[ 0 1 2 3]
# [ 8 9 10 11]]
print(np.delete(a, 1, 1))
# [[ 0 2 3]
# [4 6 7]
# [ 8 10 11]]
# Deleting multiple rows or columns
print(np.delete(a, [0, 3], 1))
# [[ 1 2]
# [5 6]
# [ 9 10]]
# Deleting rows and columns
print(np.delete(np.delete(a, 1, 0), 1, 1))
# [[ 0 2 3]
# [ 8 10 11]]
```

4

```
# encoding the probabilities as a numpy array
trans_array = np.array([
    [0.002, 0.666, 0.01, 0.020, 0.302],
    [0.466, 0.102, 0.02, 0.032, 0.38],
    [0.0, 0.0, 1, 0.0, 0.0],
    [0, 0, 0, 1, 0],
    [0.11, 0.122, 0.066, 0.004, 0.698]
])
# ensures that the probabilities sum to 1
assert(trans_array[0].sum() == 1.0)
assert(trans_array[1].sum() == 1.0)
assert(trans array[2].sum() == 1.0)
assert(trans array[3].sum() == 1.0)
assert(trans array[4].sum() == 1.0)
# encoding the initial probability of as a numpy array
state = np.array([[0.3, 0.4, 0.1, 0.15, 0.05]])
assert(state[0].sum() == 1.0)
```



##Problem 3 (4 points)

It seems that there is a bug in **_Move-o-Tron 99_* and feedback units as absorbing states. After updat **_Move-o-Tron 99_**, Captain Holt wants to find ow has on the probability of a person giving feedback. including Santiago and the other one without.

Matrix 1 (With Santiago)

```
| |Major Crimes|Traffic|General crimes|Feedback|The
|---|---|---|
|Major Crimes|0\.002|0\.232|0\.31|0\.434|0\.022|
|Traffic|0\.426|0\.102|0\.222|0\.04|0\.21|
|General crimes|0\.03|0\.11|0\.2|0\.294|0\.366|
|Feedback|0\.003|0\.176|0\.321|0\.3|0\.2|
|Theft|0\.11|0\.422|0\.166|0\.1|0\.202|
```

Matrix 2 (Without Santiago)

```
| |Major Crimes|Traffic|General crimes|Feedback|The
|---|---|---|---|
|Major Crimes|0\.11|0\.222|0\.092|0\.374|0\.202|
|Traffic|0\.03|0\.11|0\.2|0\.294|0\.366|
|General crimes|0\.002|0\.232|0\.31|0\.434|0\.022|
|Feedback|0\.466|0\.102|0\.02|0\.032|0\.38|
|Theft|0\.003|0\.176|0\.321|0\.3|0\.2|
```

1. How can you find out the effect that Santiago ha

Problem 3 (4 points)

It seems that there is a bug in *Move-o-Tron 99* which makes general crimes and feedback units as absorbing states. After updating the software of *Move-o-Tron 99*, Captain Holt wants to find out the effect that Amy Santiago has on the probability of a person giving feedback. So one matrix is generated including Santiago and the other one without.

Matrix 1 (With Santiago)

	Major Crimes	Traffic	General crimes	Feedback
Major Crimes	0.002	0.232	0.31	0.434
Traffic	0.426	0.102	0.222	0.04
General crimes	0.03	0.11	0.2	0.294
Feedback	0.003	0.176	0.321	0.3
Theft	0.11	0.422	0.166	0.1
	Traffic General crimes Feedback	Major Crimes 0.002 Traffic 0.426 General crimes 0.03 Feedback 0.003	Major Crimes 0.002 0.232 Traffic 0.426 0.102 General crimes 0.03 0.11 Feedback 0.003 0.176	Traffic 0.426 0.102 0.222 General crimes 0.03 0.11 0.2 Feedback 0.003 0.176 0.321

Matrix 2 (Without Santiago)

	Major Crimes	Traffic	General crimes	Feedback
Major Crimes	0.11	0.222	0.092	0.374
Traffic	0.03	0.11	0.2	0.294
General crimes	0.002	0.232	0.31	0.434
Feedback	0.466	0.102	0.02	0.032

recaback. (1 point)

2. What effect does Santiago have one the probabili
point)

Note: The initial probablity of a person going particular day remains the same

3. Name the test Captain Holt is performing. (0.5 $\rm p$

Lina Ginetti reports to Captain Holt that the there precient _"There are normal days and then there are with a tiny dash of pathetic."_. Captain Holt decid probablity of a person going to a particular unit d

4. Without the information about these inital probathere is any difference in the probability of getti points)

Major Crimes		Traffic	General crimes	Feedback
Theft	0.003	0.176	0.321	0.3

- 1. How can you find out the effect that Santiago has on the probability of feedback? (1 point)
- 2. What effect does Santiago have one the probability of getting feedback? (1 point)
 Note: The initial probablity of a person going to a particular unit on a particular day remains the same
- 3. Name the test Captain Holt is performing. (0.5 points)

Lina Ginetti reports to Captain Holt that the there two kinds of days in the precient "There are normal days and then there are days where workflow is dismal with a tiny dash of pathetic.". Captain Holt decided to sample the initial probablity of a person going to a particular unit on a good day and a bad day.

4. Without the information about these inital probabilities, can you tell if there is any difference in the probability of getting a feedback? Explain. (1.5 points)

```
# encoding the probabilities as a numpy array
# With Santiago
trans_array_with_amy = np.array([
    [0.002, 0.232, 0.31, 0.434, 0.022],
    [0.426, 0.102, 0.222, 0.04, 0.21],
    [0.03, 0.11, 0.20, 0.294, 0.366],
    [0.003, 0.176, 0.321, 0.3, 0.2],
    [0.11, 0.422, 0.166, 0.1, 0.202]
])
# Without Santiago
trans_array_without_amy = np.array([
    [0.11, 0.222, 0.092, 0.374, 0.202],
    [0.03, 0.11, 0.20, 0.294, 0.366],
    [0.002, 0.232, 0.31, 0.434, 0.022],
    [0.466, 0.102, 0.02, 0.032, 0.38],
    [0.003, 0.176, 0.321, 0.3, 0.2]
])
# ensures that the probabilities sum to 1
```

```
assert(trans_array_with_amy[0].sum() == 1.0)
assert(trans_array_with_amy[1].sum() == 1.0)
assert(trans_array_with_amy[2].sum() == 1.0)
assert(trans_array_with_amy[3].sum() == 1.0)
assert(trans_array_with_amy[4].sum() == 1.0)
assert(trans_array_without_amy[0].sum() == 1.0)
assert(trans_array_without_amy[1].sum() == 1.0)
assert(trans_array_without_amy[2].sum() == 1.0)
assert(trans_array_without_amy[3].sum() == 1.0)
# encoding the initial probability of as a numpy array state = np.array([[0.3, 0.4, 0.1, 0.15, 0.05]])
assert(state[0].sum() == 1.0)
```