

# Math 4430 Project Python Code Zijiang Yan

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```
[1]: import numpy as np
import random
from __future__ import division

Q_1 = np.zeros((20,20))

for i in range(0, 20, 1):
    for j in range(0, 20, 1):

        Q_1[i][j]=(1/20)

#print(Q_1)
print("There are 5 pairs forbidden cities")
for k in range(0,5,1):
    value1 = random.randint(0, 20) #random pick 1 city in the city_list.
    value2 = random.randint(0, 20) #random pick 1 city in the city_list.
    # we need to make sure different city
    while(value1 == value2):
        value2 = random.randint(0, 20)
    print("The forbidden pair of cities index ", k, " is ",value1,value2)
    for i in range(0, 20, 1):
        for j in range(0, 20, 1):

            if(i == j):
                Q_1[i][j] = 0 # It is not possible if we departure and arrive in
                →the same city for single route

                # otherwise, forbidden city pairs should be mark as 0.
                Q_1[value1-1][value2-1] = 0 # value1 to value2 is forbidden
                Q_1[value2-1][value1-1] = 0 #the counterpart is forbidden
#print(Q_1)

def count_non_zero(row):
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    # if transition state is not 0 , means it has the probability to approach
    → the other city
    # for example {0.5,0.5,0,0,0,...} the result should be 2
    count= 0
    for j in range(0, 20, 1):
        if Q_1[row][j] != 0:
            count = count +1

    return count # count is non-zero result

for i in range(0, 20, 1):
    non_zero_count = count_non_zero(i)
    for j in range(0, 20, 1):
        if Q_1[i][j] != 0: # if there is not in the same city
            Q_1[i][j] = 1/non_zero_count # we redefine the Q matrix make
            → non-zero probability are uniform.

print(Q_1) # old transition matrix
Q =Q_1

```

There are 5 pairs forbidden cities

The forbidden pair of cities index 0 is 6 14

The forbidden pair of cities index 1 is 16 13

The forbidden pair of cities index 2 is 5 13

The forbidden pair of cities index 3 is 4 10

The forbidden pair of cities index 4 is 4 9

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[[0.          0.05263158 0.05263158 0.05263158 0.05263158 0.05263158
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  0.05555556 0.05555556 0.05555556 0.05555556 0.05555556 0.05555556
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[illegible]

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 0.05263158 0.
 ]]
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[2]: Q_2 = np.zeros((20,20)) #travel distance matrix
for i in range(0, 20, 1):
    for j in range(0, 20, 1):
        # 1/20 no forbidde
        if(i == j):
            Q_2[i][j] = 0 # depature and arrival are same city ,mark is as 0

        else:
            value = random.randint(1, 100) #find random distance from 0 to 100.
            Q_2[i][j] = value # assign the distance to the i,j entry.

#print(Q_2)

for i in range(0, 20, 1):
    for j in range(0, 20, 1):
        if Q_2[i][j] != 0:
            Q_2[j][i] = Q_2[i][j] # we need to make sure the distance from city A
            #make sure it is symmetry
print(Q_2)
```

```

[[ 0.  44.  10.  63.  31.  65.  30.  59.   4.  90.  94.  99.  78.  76.
  21.  45.  23.  27.  19.  13.]
 [ 44.   0.  19.  83.  37.  90.  59.  90.  76.  86.  29.  64.  58.  53.
  92.  58.  33.  40.  84.  71.]
 [ 10.  19.   0.  92.  47.  33.  89.  18.  31.  98.  24.  78.  20.   5.
  17.  54.  80.  60.  32.  25.]
 [ 63.  83.  92.   0.  35.  12.  20.  29.  57.  21.  47.  55.  93.  55.
  30.  23.  30.  54.  96.  34.]
 [ 31.  37.  47.  35.   0.  99.  76.  53.  72.  96.  27.  12.  55.  38.
  27.  78.  40.  38.  35.  30.]
 [ 65.  90.  33.  12.  99.   0.  48.  83.   5.  17.  50.  52.  81.  11.
   7.  71.  49.  80.   8.  60.]
 [ 30.  59.  89.  20.  76.  48.   0.  18.  85.  40.  45.  59.  78.  74.]
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63. 46. 91. 96. 46. 87.]
[ 59. 90. 18. 29. 53. 83. 18. 0. 54. 21. 33. 31. 92. 39.
 73. 25. 11. 98. 20. 35.]
[ 4. 76. 31. 57. 72. 5. 85. 54. 0. 22. 7. 41. 40. 100.
 70. 33. 42. 77. 82. 86.]
[ 90. 86. 98. 21. 96. 17. 40. 21. 22. 0. 98. 98. 34. 80.
 85. 18. 81. 30. 8. 55.]
[ 94. 29. 24. 47. 27. 50. 45. 33. 7. 98. 0. 80. 83. 72.
 88. 22. 84. 85. 71. 57.]
[ 99. 64. 78. 55. 12. 52. 59. 31. 41. 98. 80. 0. 75. 70.
 94. 85. 33. 96. 6. 82.]
[ 78. 58. 20. 93. 55. 81. 78. 92. 40. 34. 83. 75. 0. 37.
 92. 22. 73. 84. 86. 33.]
[ 76. 53. 5. 55. 38. 11. 74. 39. 100. 80. 72. 70. 37. 0.
 18. 83. 59. 56. 94. 65.]
[ 21. 92. 17. 30. 27. 7. 63. 73. 70. 85. 88. 94. 92. 18.
 0. 6. 95. 16. 31. 35.]
[ 45. 58. 54. 23. 78. 71. 46. 25. 33. 18. 22. 85. 22. 83.
 6. 0. 89. 65. 4. 50.]
[ 23. 33. 80. 30. 40. 49. 91. 11. 42. 81. 84. 33. 73. 59.
 95. 89. 0. 5. 6. 29.]
[ 27. 40. 60. 54. 38. 80. 96. 98. 77. 30. 85. 96. 84. 56.
 16. 65. 5. 0. 88. 41.]
[ 19. 84. 32. 96. 35. 8. 46. 20. 82. 8. 71. 6. 86. 94.
 31. 4. 6. 88. 0. 99.]
[ 13. 71. 25. 34. 30. 60. 87. 35. 86. 55. 57. 82. 33. 65.
 35. 50. 29. 41. 99. 0.]]

```

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[3]: # Metropolis Algorithm
pi=[] # we construct a uniform initial distributution
for j in range(0, 20, 1):
    # 1/20 no forbidde
    pi.append(1/20)
print("Initial Distribution ",pi)

```

Initial Distribution [0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05, 0.05]

```

[4]: from __future__ import division
import math

# this part is simply compute alpha = min(1, miu_k/miu_j)
def alpha (r,c):#r,c from 0-4
    r = r-1
    c = c-1
    if((pi[r]*Q[r][c])==0):
        x = -1 #Denominator is 0 error
    else:

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x = (pi[c]*Q[c][r]* 1.0)/(pi[r]*Q[r][c])

if(x>1):
    result = 1
elif (x > 0): # 0<x<1
    result = x
else:
    result = -1 #error
return result

```

```

[5]: def new_transition(i,j):#compute new transition matrix
    i = i-1
    j = j-1
    result = -1 #error
    #if r != c:
    if alpha(i,j) != -1: #if i != j:
        result = Q[i][j] * alpha(i+1,j+1) *1.0
    else: # if i == j
        result = 1
        for k in range(0, len(Q), 1):
            if k != i:
                result = result - Q[i][k] * alpha(i+1,k+1) *1.0

    return result

for i in range(1, len(pi)+1, 1): #compute diagonal of new transition matrix P
    print("fnewTransition(%d,%d)is%f",i,i,new_transition(i,i))

```

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fnewTransition(%d,%d)is%f 1 1 5.551115123125783e-16
fnewTransition(%d,%d)is%f 2 2 5.551115123125783e-16
fnewTransition(%d,%d)is%f 3 3 5.551115123125783e-16
fnewTransition(%d,%d)is%f 4 4 0.08737530099759233
fnewTransition(%d,%d)is%f 5 5 0.035087719298245806
fnewTransition(%d,%d)is%f 6 6 0.035087719298245806
fnewTransition(%d,%d)is%f 7 7 5.551115123125783e-16
fnewTransition(%d,%d)is%f 8 8 5.551115123125783e-16
fnewTransition(%d,%d)is%f 9 9 0.03508771929824592
fnewTransition(%d,%d)is%f 10 10 0.03508771929824592
fnewTransition(%d,%d)is%f 11 11 5.551115123125783e-16
fnewTransition(%d,%d)is%f 12 12 5.551115123125783e-16
fnewTransition(%d,%d)is%f 13 13 0.08737530099759222
fnewTransition(%d,%d)is%f 14 14 0.035087719298245806
fnewTransition(%d,%d)is%f 15 15 5.551115123125783e-16
fnewTransition(%d,%d)is%f 16 16 0.03508771929824578
fnewTransition(%d,%d)is%f 17 17 5.551115123125783e-16
fnewTransition(%d,%d)is%f 18 18 5.551115123125783e-16
fnewTransition(%d,%d)is%f 19 19 5.551115123125783e-16

```

```
fnewTransition(%d,%d)is%f 20 20 5.551115123125783e-16
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```
[10]: A = np.zeros((len(Q),len(Q[0])))

for i in range(0, len(Q), 1):
    for j in range(0, len(Q[0]), 1):
        A[i][j] = new_transition(i,j)
display("Initial transition matrix")
print(A)
from numpy.linalg import matrix_power
display("transition matrix Repeating 10 times")
A_2 =matrix_power(A, 10) #This is the new Transition Matrix after 10 repetitions.
print(A_2)

display("transition matrix Repeating 20 times")
A_2 =matrix_power(A, 20) #This is the new Transition Matrix after 10 repetitions.
print(A_2)
#A_100 =matrix_power(A, 100)
#print(A_100)
```

'Initial transition matrix'

```
[ [ 5.55111512e-16  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02]
 [ 5.26315789e-02  5.55111512e-16  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02]
 [ 5.26315789e-02  5.26315789e-02  5.55111512e-16  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02]
 [ 5.26315789e-02  5.26315789e-02  5.26315789e-02  5.55111512e-16
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02]
 [ 5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
    8.73753010e-02  5.55555556e-02  5.55555556e-02  5.26315789e-02
    5.26315789e-02 -0.00000000e+00 -0.00000000e+00  5.26315789e-02
    5.26315789e-02  5.88235294e-02  5.55555556e-02  5.26315789e-02
    5.55555556e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02]
 [ 5.26315789e-02  5.26315789e-02  5.26315789e-02  5.26315789e-02
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[illegible]



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5.55555556e-02 3.50877193e-02 5.26315789e-02 5.26315789e-02]
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5.26315789e-02 5.26315789e-02 5.26315789e-02 5.26315789e-02
5.26315789e-02 5.26315789e-02 5.26315789e-02 5.55111512e-16
5.26315789e-02 5.26315789e-02 5.26315789e-02 5.26315789e-02]
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'transition matrix Repeating 10 times'

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[[0.04592766 0.04592766 0.04592766 0.04592766 0.04597006 0.04263984
0.0475301 0.04371989 0.04592766 0.04591616 0.04505213 0.04520991
0.04592766 0.04610995 0.0451279 0.04371989 0.04590846 0.04516803
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0.04592766 0.04610995 0.0451279 0.04371989 0.04590846 0.04516803
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0.04592766 0.04610995 0.0451279 0.04371989 0.04590846 0.04516803
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0.04758448 0.04376991 0.0459802 0.04596869 0.04510367 0.04526164
0.0459802 0.04616271 0.04517953 0.04376991 0.04596099 0.04521971

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0.0459802 0.0459802 ]  
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 0.04750658 0.04750658]  
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 0.0452453 0.04161825 0.04371989 0.04370894 0.04288645 0.04303665  
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 0.04371989 0.04371989]  
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 0.04602527 0.04620795 0.04522381 0.04381281 0.04600603 0.04526403  
 0.04602527 0.04602527]  
 [0.04673421 0.04673421 0.04673421 0.04673421 0.04677736 0.04338866  
 0.0483648 0.04448767 0.04673421 0.04672251 0.04584331 0.04600387  
 0.04673421 0.04691971 0.04592041 0.04448767 0.04671468 0.04596125  
 0.04673421 0.04673421]  
 [0.04371989 0.04371989 0.04371989 0.04371989 0.04376026 0.04059012  
 0.0452453 0.04161825 0.04371989 0.04370894 0.04288645 0.04303665  
 0.04371989 0.04389342 0.04295857 0.04161825 0.04370162 0.04299678  
 0.04371989 0.04371989]  
 [0.04592215 0.04592215 0.04592215 0.04592215 0.04596455 0.04263473  
 0.0475244 0.04371464 0.04592215 0.04591065 0.04504672 0.04520449  
 0.04592215 0.04610442 0.04512248 0.04371464 0.04590295 0.04516261

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0.04592215 0.04592215]
[0.04356767 0.04356767 0.04356767 0.04356767 0.0436079 0.0404488
0.04508777 0.04147335 0.04356767 0.04355676 0.04273713 0.04288681
0.04356767 0.0437406 0.04280901 0.04147335 0.04354946 0.04284708
0.04356767 0.04356767]
[0.04592766 0.04592766 0.04592766 0.04592766 0.04597006 0.04263984
0.0475301 0.04371989 0.04592766 0.04591616 0.04505213 0.04520991
0.04592766 0.04610995 0.0451279 0.04371989 0.04590846 0.04516803
0.04592766 0.04592766]
[0.04592766 0.04592766 0.04592766 0.04592766 0.04597006 0.04263984
0.0475301 0.04371989 0.04592766 0.04591616 0.04505213 0.04520991
0.04592766 0.04610995 0.0451279 0.04371989 0.04590846 0.04516803
0.04592766 0.04592766]]

```

'transition matrix Repeating 20 times'

```

[[0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419
0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956
0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183
0.04137618 0.04137618]
[0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419
0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956
0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183
0.04137618 0.04137618]
[0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419
0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956
0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183
0.04137618 0.04137618]
[0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419
0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956
0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183
0.04137618 0.04137618]
[0.04142351 0.04142351 0.04142351 0.04142351 0.04146176 0.03845814
0.04286881 0.03943226 0.04142351 0.04141314 0.04063385 0.04077616
0.04142351 0.04158793 0.04070219 0.03943226 0.0414062 0.04073839
0.04142351 0.04142351]
[0.03986553 0.03986553 0.03986553 0.03986553 0.03990234 0.03701168
0.04125646 0.03794917 0.03986553 0.03985555 0.03910556 0.03924252
0.03986553 0.04002376 0.03917133 0.03794917 0.03984887 0.03920617
0.03986553 0.03986553]
[0.04279862 0.04279862 0.04279862 0.04279862 0.04283814 0.03973481
0.04429189 0.04074127 0.04279862 0.04278791 0.04198274 0.04212978
0.04279862 0.0429685 0.04205335 0.04074127 0.04278074 0.04209075
0.04279862 0.04279862]
[0.0393872 0.0393872 0.0393872 0.0393872 0.03942357 0.0365676
0.04076144 0.03749383 0.0393872 0.03937734 0.03863635 0.03877167
0.0393872 0.03954354 0.03870133 0.03749383 0.03937074 0.03873575
0.0393872 0.0393872 ]

```

[0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419  
 0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956  
 0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183  
 0.04137618 0.04137618]  
 [0.04137344 0.04137344 0.04137344 0.04137344 0.04141165 0.03841165  
 0.04281699 0.0393846 0.04137344 0.04136309 0.04058473 0.04072687  
 0.04137344 0.04153766 0.04065299 0.0393846 0.04135615 0.04068915  
 0.04137344 0.04137344]  
 [0.04056563 0.04056563 0.04056563 0.04056563 0.04060309 0.03766167  
 0.04198099 0.03861562 0.04056563 0.04055547 0.03979232 0.03993168  
 0.04056563 0.04072664 0.03985924 0.03861562 0.04054868 0.03989469  
 0.04056563 0.04056563]  
 [0.03936305 0.03936305 0.03936305 0.03936305 0.03939939 0.03654517  
 0.04073645 0.03747084 0.03936305 0.03935319 0.03861266 0.03874789  
 0.03936305 0.03951928 0.0386776 0.03747084 0.0393466 0.038712  
 0.03936305 0.03936305]  
 [0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419  
 0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956  
 0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183  
 0.04137618 0.04137618]  
 [0.04146411 0.04146411 0.04146411 0.04146411 0.0415024 0.03849583  
 0.04291082 0.03947091 0.04146411 0.04145373 0.04067367 0.04081613  
 0.04146411 0.04162869 0.04074208 0.03947091 0.04144679 0.04077831  
 0.04146411 0.04146411]  
 [0.0421028 0.0421028 0.0421028 0.0421028 0.04214168 0.0390888  
 0.0435718 0.0400789 0.0421028 0.04209226 0.04130019 0.04144483  
 0.0421028 0.04226992 0.04136965 0.0400789 0.04208521 0.04140644  
 0.0421028 0.0421028 ]  
 [0.0393872 0.0393872 0.0393872 0.0393872 0.03942357 0.0365676  
 0.04076144 0.03749383 0.0393872 0.03937734 0.03863635 0.03877167  
 0.0393872 0.03954354 0.03870133 0.03749383 0.03937074 0.03873575  
 0.0393872 0.0393872 ]  
 [0.04137121 0.04137121 0.04137121 0.04137121 0.04140941 0.03840958  
 0.04281468 0.03938247 0.04137121 0.04136085 0.04058254 0.04072468  
 0.04137121 0.04153542 0.0406508 0.03938247 0.04135392 0.04068695  
 0.04137121 0.04137121]  
 [0.03925007 0.03925007 0.03925007 0.03925007 0.03928631 0.03644028  
 0.04061953 0.03736329 0.03925007 0.03924024 0.03850183 0.03863668  
 0.03925007 0.03940586 0.03856659 0.03736329 0.03923366 0.03860089  
 0.03925007 0.03925007]  
 [0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419  
 0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956  
 0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183  
 0.04137618 0.04137618]  
 [0.04137618 0.04137618 0.04137618 0.04137618 0.04141438 0.03841419  
 0.04281982 0.0393872 0.04137618 0.04136582 0.04058741 0.04072956  
 0.04137618 0.04154041 0.04065567 0.0393872 0.04135889 0.04069183  
 0.04137618 0.04137618]]

```
[12]: display(' since all entries are approximately equal to 0.05, then we can prove
→the matrix A is reversible, and the pi[0.05,0.05,...,0.05]is the initial
→distribution')
display(' since all entries are greater than 0 after repetition(10,100
→times),then we can prove the matrix A is irreducible')
```

' since all entries are approximately equal to 0.05, then we can prove the matrix A is reversible

' since all entries are greater than 0 after repetition(10,100 times),then we can prove the matrix

```
[14]: #A_2 is new transition unner metropolis algorithm

def travel_time(i):
    travel_1 = 0
    # start from 1 come back to 1
    #for i in range(0, 20, 1):
    for j in range(0, 20, 1):
        #1 transit point i -> j -> i
        travel_1 += A_2[i][j] * Q_2[i][j] + A_2[j][i] * Q_2[j][i] # distance
→* probability

    return travel_1

def travel_time_2(i):
    distance_2 = 0
    for j in range(0, 20, 1):
        for k in range(0, 20, 1):
            # 2 transit point i -> j -> k -> i
            distance_2 += A_2[i][j] * Q_2[i][j] + A_2[j][k] * Q_2[j][k]
→+ A_2[k][i] * Q_2[k][i] # distance * probability
    return distance_2

for i in range(0, 20, 1):
    print("the 1 iteration average time of city ", i," is ",travel_time(i) )
    print("the 2 iteration average time of city ", i," is ",travel_time_2(i) )
    print(travel_time)
```

```
the 1 iteration average time of city 0 is 72.6446240748816
the 2 iteration average time of city 0 is 2272.7862271537856
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 1 is 95.35328032721448
the 2 iteration average time of city 1 is 2726.9593522004375
```

```

<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 2 is 68.2588816778353
the 2 iteration average time of city 2 is 2185.071379212859
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 3 is 76.31661958260571
the 2 iteration average time of city 3 is 2346.2261373082656
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 4 is 75.78655121649018
the 2 iteration average time of city 4 is 2335.6247699859578
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 5 is 71.23964828655951
the 2 iteration average time of city 5 is 2244.686711387343
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 6 is 97.48348762776247
the 2 iteration average time of city 6 is 2769.5634982114016
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 7 is 68.70277319958304
the 2 iteration average time of city 7 is 2193.9492096478143
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 8 is 80.99742037612431
the 2 iteration average time of city 8 is 2439.842153178639
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 9 is 88.6018916588495
the 2 iteration average time of city 9 is 2591.931578833141
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 10 is 88.21090683802635
the 2 iteration average time of city 10 is 2584.111882416681
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 11 is 96.03681534846473
the 2 iteration average time of city 11 is 2740.6300526254468
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 12 is 99.31336885362722
the 2 iteration average time of city 12 is 2806.1611227287003
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 13 is 89.27726524823913
the 2 iteration average time of city 13 is 2605.4390506209356
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 14 is 78.85350532408285
the 2 iteration average time of city 14 is 2396.9638521378106
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 15 is 68.41528893955049
the 2 iteration average time of city 15 is 2188.1995244471645
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 16 is 78.26742924471891
the 2 iteration average time of city 16 is 2385.24233055053
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 17 is 89.74616552786652
the 2 iteration average time of city 17 is 2614.817056213483

```

```

<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 18 is 75.36881176536473
the 2 iteration average time of city 18 is 2327.2699809634473
<function travel_time at 0x0000028421DA9280>
the 1 iteration average time of city 19 is 80.9127561944581
the 2 iteration average time of city 19 is 2438.1488695453145
<function travel_time at 0x0000028421DA9280>

```

```

[9]: def check_symmetric(a, rtol=1e-05, atol=1e-08): # check Q is symmetry
      return not np.allclose(a, a.T, rtol=rtol, atol=atol)

      check_symmetric(A)
      print("Check new Transition Matrix A is symmetry: ",check_symmetric(A))
      display(We have prove this travelling matrix is symmetry )

```

Check new Transition Matrix A is symmetry: True

```
[ ]:
```