

Printed M out:

M

```
[[0. 0. 0.6 0. 0. 0. 0.1 0. 0. 0.]  
 [0. 0. 0. 0. 0.3 0. 0. 0. 0. 0.]  
 [0. 0.2 0. 0. 0.3 0.1 0. 0. 0.1 0.]  
 [0. 0. 0. 0. 0. 0.1 0. 0.5 0.4 0.]  
 [0. 0. 0. 0. 0. 0.4 0. 0. 0. 0.]  
 [0.6 0. 0. 0. 0. 0. 0.5 0. 0. 0.]  
 [0. 0. 0. 0. 0. 0. 0.4 0. 0.1 0.5]  
 [0.4 0.5 0. 0.2 0.3 0. 0. 0. 0. 0.]  
 [0. 0. 0. 0.4 0. 0. 0. 0.5 0. 0.]  
 [0. 0.3 0.4 0.4 0.1 0.4 0. 0. 0.4 0.5]]
```

size

10

A:

Eigen Analysis

```
[-0.12035 +0.j      -0.0974722 -0.0964816j -0.0974722 +0.0964816j  
-0.05636152+0.31121603j -0.05636152-0.31121603j  0.33275266+0.20436279j  
 0.33275266-0.20436279j -0.3779016 +0.j      -0.38715739+0.01149969j  
-0.38715739-0.01149969j]  
norm 1.0  
sum (-0.9147284788397201+0j)
```

State Propagation

```
[0.04832012 0.0175804 0.04136312 0.06662768 0.05860132 0.14650329  
 0.23502244 0.05902418 0.05616316 0.2707943 ]  
norm 0.41096793674714016  
sum 1.00000000000000016
```

Matrix Power

```
[0.04832012 0.0175804 0.04136312 0.06662768 0.05860132 0.14650329  
 0.23502244 0.05902418 0.05616316 0.2707943 ]  
norm 0.41096793674714016  
sum 1.00000000000000016
```

Random Walk

```
[0.02 0.02 0.03 0.08 0.06 0.15 0.25 0.09 0.03 0.27]  
norm 0.4226109321823088  
sum 1.0
```

B:

Run matrix power and state propagation techniques with q_0 as a distribution. For what value of t is required to get as close to the true answer as the older initial state?

Intro:

Assume the markov chain converges at $t=2048$, when $q^* = M \times q^*$.

Here is the L1 norm: 0.41096793674713994

I will increment t , and record the delta norm value from the L1 norm above. If the difference is less than 0.0001, that is when it "gets as close to the true answer as the older initial state".

*****State Propagation: *****

converged case when $t == 2048$

[0.04832012 0.0175804 0.04136312 0.06662768 0.05860132 0.14650329
0.23502244 0.05902418 0.05616316 0.2707943]

norm: 0.41096793674713994

iterate from $t = 1$ to 100

case when $t == 1$, delta from converged result: 0.17493434590763998

case when $t == 2$, delta from converged result: 0.11351543995478222

case when $t == 3$, delta from converged result: 0.05867270887367954

case when $t == 4$, delta from converged result: 0.031501864835394536

case when $t == 5$, delta from converged result: 0.017631111365310943

case when $t == 6$, delta from converged result: 0.011501514966775376

case when $t == 7$, delta from converged result: 0.007024912382931624

case when $t == 8$, delta from converged result: 0.003792159405752857

case when $t == 9$, delta from converged result: 0.0019485119459941543

case when $t == 10$, delta from converged result: 0.0011257986797107047

case when $t == 11$, delta from converged result: 0.000747147340373778

case when $t == 12$, delta from converged result: 0.00045823964798244433

case when $t == 13$, delta from converged result: 0.00024472348751521594

case when $t == 14$, delta from converged result: 0.0001249565563763112

case when $t == 15$, delta from converged result: 7.331760200230261e-05

case when $t == 16$, delta from converged result: 4.8121418777239945e-05

*****Matrix Power: *****

converged case when $t = 2048$

[0.04832012 0.0175804 0.04136312 0.06662768 0.05860132 0.14650329
0.23502244 0.05902418 0.05616316 0.2707943]

norm: 0.41096793674716386

iterate from $t = 1$ to 100

case when $t = 1$, delta from converged result: 0.17493434590765075

case when $t = 2$, delta from converged result: 0.11351543995478824

case when $t = 3$, delta from converged result: 0.05867270887367867

case when $t = 4$, delta from converged result: 0.031501864835386126

case when $t = 5$, delta from converged result: 0.017631111365297596

case when $t = 6$, delta from converged result: 0.01150151496676444

case when $t = 7$, delta from converged result: 0.007024912382926099

case when $t = 8$, delta from converged result: 0.0037921594057542885

case when $t = 9$, delta from converged result: 0.0019485119460033926

case when $t = 10$, delta from converged result: 0.0011257986797240814

case when $t = 11$, delta from converged result: 0.0007471473403844537

case when $t = 12$, delta from converged result: 0.0004582396479874991

case when $t = 13$, delta from converged result: 0.0002447234875132012

case when $t = 14$, delta from converged result: 0.00012495655636648542

case when $t = 15$, delta from converged result: 7.331760198900188e-05

case when $t = 16$, delta from converged result: 4.812141876691809e-05

Conclusion:

$t = 14$ for state propagation and matrix power

C.

Technique	PRO	CON
State Propagation	Produces accurate results in reasonable efficiency. Useful for medium sized data.	Slower than matrix power as it is linearly multiplying the matrix with q_t .
Matrix Power	<p>Decent when the probability transition matrix does not change often, as it precomputes the matrix power by t before multiplying it by q_0.</p> <p>It is excellent for cases when you need to compute something about all states, as you can just pre-power the matrix and multiply it by all q_t</p> <p>It is more efficient than state propagation when uses dynamic programming to pre-power the matrix</p>	Not helpful if your probability transition matrix is changing all the time, as the precomputed result would quickly render useless.
Eigen Analysis	<p>Very straightforward to implement, useful for small data when there is no need to multiply the Probability Transition Matrix for 2000 times.</p> <p>For example, compute your relationship with people in a ten people group chat.</p>	Impossible for large scale pieces of data as Eigenvector Decomposition is slow for large matrices. Say, describe the relationship between all webpages on this planet.
Random Walk	<p>The most efficient solution.</p> <p>Great for large datasets.</p> <p>Because it does not require any matrix arithmetics, you can feed an adjacency list representation of the graph to this technique. (adjacency list is excellent for sparse graphs like website links)</p>	Unstable result. Each run can return different results, requiring large t to produce accurate results.

D.

It is ergodic.

An ergodic markov chain cannot be:

1. cyclic

Part B shows that q^* slowly converges because $q^* = M \times q^*$.

2. has absorbing and transient states

Part B shows with distribution q_0 , all states are accessible.

3. disconnected nodes

The p^* computed from all four techniques shows all values in q^* are above 0, meaning the initial state shown in q_0 has a path to all states.

E.

	0	1	2	3	4	5	6	7	8	9
0	0	0	0.6	0	0	0	0.1	0	0	0
1	0	0	0	0	0.3	0	0	0	0	0
2	0	0.2	0	0	0.3	0.1	0	0	0.1	0
3	0	0	0	0	0	0.1	0	0.5	0.4	0
4	0	0	0	0	0	0.4	0	0	0	0
5	0.6	0	0	0	0	0	0.5	0	0	0
6	0	0	0	0	0	0	0.4	0	0.1	0.5
7	0.4	0.5	0	0.2	0.3	0	0	0	0	0
8	0	0	0	0.4	0	0	0	0.5	0	0
9	0	0.3	0.4	0.4	0.1	0.4	0	0	0.4	0.5

What nodes can be reached from node 5 in one step, and with what probabilities?

node 5 can reach node 2 at $Pr=0.1$, node 3 at $Pr=0.1$, node 4 at $Pr=0.4$, node 9 at $Pr=0.4$