



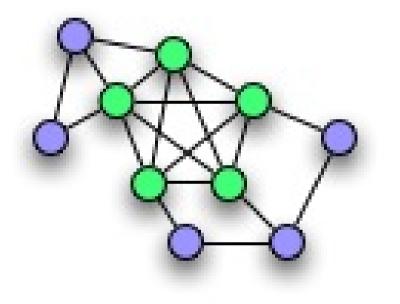
## Abstract

In an undirected graph, a clique is a subset of vertices such that every two vertices are connected by an edge; that is to say the clique itself is a complete graph found within the graph. The clique problem is classified as NP-Complete. As the starting graph increases in number of vertices and edges it becomes very difficult to find the answer, the maximum clique, in polynomial time.

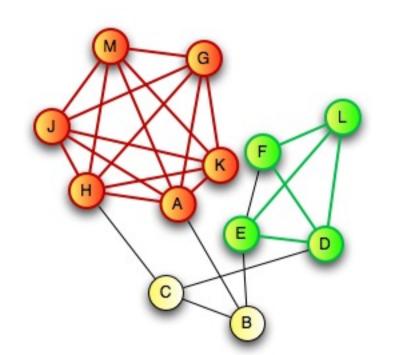
# What is a Clique?

A clique is a set of vertices in a graph, such that every vertex is connected to every other vertex in the graph. In other words, it is a (sub)complete graph.

In the below picture, the green points form a 5clique.



A maximal clique is not a subset of any other clique. It is the maximum sized clique for those vertices.



Both Orange and Green are Maximal Cliques, while Orange is the Maximum Clique

The maximum clique is a maximal clique that has maximum cardinality; it is the clique with the largest number of vertices.

Protein structure prediction can be viewed as a problem of finding cliques in a graph whose vertices represent positions of molecules in the protein. By seeing a protein-protein interaction network as cliques, or clusters of proteins that interact with each other and don't interact as frequently outside their cluster.

# Generating a Graph

This code generates a graph on two constraints which allows me to specify the number of points (vertices) the graph will contain and a maximum distance that if two points are within such distance are joined by an edge. The code randomly places the points before applying the connections.

t2 = SessionTime[] r = .1; numberofpoints = 100; points = {{RandomReal[], RandomReal[]}}; n = 0; lines = {};  $v = \{1\};$ Do [ points = Append[points, {RandomReal[], RandomReal[]}] n++; v = Append [v, n]; f[i, n] = If [Norm[points[[i]] - points[[-1]]] < r, True, False],</pre> {i, 1, Length[points] - 1}]; lines = Union[lines DeleteCases Table [If [Norm [points [[i]] - points [[-1]]] < r, Line[{points[[i]], points[[-1]]}]] {i, 1, Length[points] - 1}], Null]], {k, 1, numberofpoints}] G = MakeGraph [v, f, Type -> Undirected]; Graphics[{{PointSize[0.02], Red, Point[points]}} {PointSize[Large], Blue, lines}}] end = SessionTime[] - t2

# Finding the Maximum Cliques

nificantly faster. tex. start = SessionTime[] DList = Degrees[G]; EList = EdgeList[G]; MyList = {}; Do[{H = EList[[1;; DList[[1]]]] EList = Complement[EList, H];, A = Flatten[H],B = Complement[A, {0}] DList = Delete[DList, 1], Last [Thing]; CliquesOf[2] = EdgeList[G]; Do[{Inter = MyList[[k3]],  $Stuff = \{k3\},\$ A = Complement[Inter, Stuff],  $Do[\{B = A[[k]]\},$ x = Length[Etc], If [Inter2 = Etc,  $\{\}$ ,

MaxCliq

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# **Efficiency in an Algorithm for Finding Cliques**

# Leanne

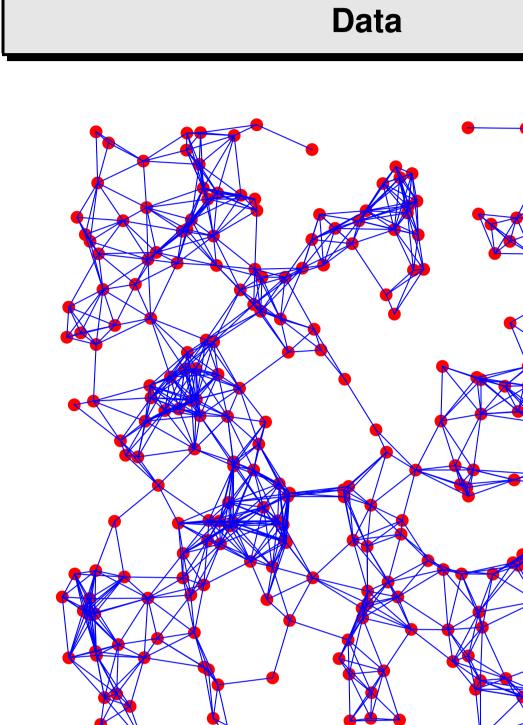
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## Methods

The basis of my code, which is written in Mathematica, is manipulating and creating lists. I discovered Mathematica has its own command to find the maximum clique, MaximumClique[G]. However, I have started testing the speed of my code against that of mathematica's command and for the graphs that I have tested, my code runs sig-

The code requires two parts of information from the graph being analyzed: a list of the degrees, and a list of the edges, ordered by the ver-

```
MyList = Append[MyList, B] }, {k, 1, Length[Degrees[G]] }
Thing = Complement [Degrees [G], {0}];
Do[CliquesOf[k] = {}, {k, 1, Last[Thing] + 1}]
    Inter2 = Intersection[Inter, MyList[[B]]]
    Etc = Sort[Flatten[{Stuff, B}]],
   C1 = Complement[Inter2, Etc],
     {Do[{y = x + 1, CliquesOf[y] = Append[CliquesOf[y],
           Sort[Flatten[{Etc, C1[[k2]]}]]}, {k2, 1, Length[C1]}]
   }, {k, 1, Length[A]}]}, {k3, 1, Length[Degrees[G]]}]
CliquesOf[3] = Complement[CliquesOf[3], {}];
Do[{If [CliquesOf[k4] = {}, {MaxCliq = CliquesOf[k4 - 1][[1]], Break[]},
   {Do[{Letters = CliquesOf[k4][[k]],
      Inter = Intersection[MyList[[Letters[[1]]]], MyList[[Letters[[2]]]]],
      Do[Inter = Intersection[Inter, MyList[[Letters[[k3]]]]],
       {k3, 3, Length[Letters]}],
      C2 = Complement[Inter, Letters],
      If[Inter =: Letters, {},
       Do[{CliquesOf[k4 + 1] = Append[CliquesOf[k4 + 1],
            Sort[Flatten[{Letters, C2[[k2]]}]],
         CliquesOf [k4 + 1] = Complement [CliquesOf [k4 + 1], {}]},
         {k2, 1, Length[C2]}]], {k, 1, Length[CliquesOf[k4]]}]},
{k4, 3, Last [Thing] + 1}]
end = SessionTime[] - start
```



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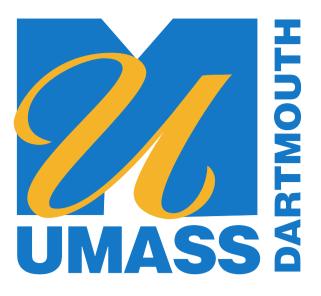
Data	My Code Mathematica Size of Max. Clique 0.382765 261.293623 4	of I
	0.367425 375.67082 4	pea
	0.384376 262.535695 4 <b>Table 3:</b> 300 points, .1 distance	hov mai
	In the following tables, Mathematica's code becomes very inefficient to return the Maximum Clique.	
	My Code Mathematica Size of Max. Clique 0.806121 1810 unfinished 4 0.693635 no attempt 4 0.71146 1250 unfinished 4 <b>Table 4:</b> 400 points, .1 distance	
Random Graph of 300 points,connecting if within distance of .1	My Code Mathematica Size of Max. Clique 1.342606 no attempt 4 1.236563 no attempt 4 1.253054 no attempt 4	rang thei able
For graphs that don't include high amounts of ertices with outrageous degrees, my code seems run in polynomial time.	Table 5: 500 points, .1 distance	158
My Method vs. Mathematica's	My Code Mathematica Size of Max. Clique 1.99273 no attempt 4	
MaximumClique[G] command	2.262895 no attempt 4 2.623419 no attempt 4 2.314154 no attempt 5	N
My CodeMathematicaSize of Max. Clique0.052422.79551430.0522842.91324630.0523154.5566353	Table 6: 600 points, .1 distance	
0.0591312.91158630.0560614.3345240.0611574.9560264	14895239 no attempt 5	gree to f
Table 1: 100 points, .1 distance	18.801664 no attempt 5 18.891935 no attempt 5 22.461103 no attempt 5 Degree Range: 10-49	rang prox
My code has yet to reach one second and athematica's has increased to over half a minute.	Table 7: 1000 points, .1 distance	amo
My Code Mathematica Size of Max. Clique 0.158542 27.006818 3	20 18 16	38 mat san
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0.210005 42.222799 4 <b>Table 2:</b> 200 points, .1 distance	4 2 0 1 2 3 4 5 6 7 8 9 10	ica: (ma
Although my code has doubled in time, it has	points(in hundreds) This is a plot of the average time stamps for	
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atica's command is taking over four minutes.		aco

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	0.71146 1250 unfinished 4 <b>Table 4:</b> 400 points, .1 distance
	My Code Mathematica Size of Max. Clique
andom Graph of 300 points,connecting if within distance of .1	1.342606       no attempt       4         1.236563       no attempt       4         1.253054       no attempt       4
For graphs that don't include high amounts of rtices with outrageous degrees, my code seems run in polynomial time.	Table 5: 500 points, .1 distance
My Method vs. Mathematica's	My Code Mathematica Size of Max. Clique
	1.99273 no attempt 4 2.262895 no attempt 4
MaximumClique[G] command	2.202033 no attempt 4 2.623419 no attempt 4 2.314154 no attempt 5
My Code         Mathematica         Size of Max. Clique           0.05242         2.795514         3           0.052284         2.913246         3	Table 6: 600 points, .1 distance
0.0523154.55663530.0591312.91158630.0560614.334524	My Code Mathematica Size of Max. Clique 11.205336 no attempt 5
0.061157 4.956026 4 <b>Table 1:</b> <i>100 points, .1 distance</i>	14.895239       no attempt       5         18.801664       no attempt       5         18.891935       no attempt       5
My code has yet to reach one second and athematica's has increased to over half a minute.	22.461103 no attempt 5 Degree Range: 10-49 Table 7: 1000 points, .1 distance
	20
My Code Mathematica Size of Max. Clique	18
0.158542 27.006818 3	16 14
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0.162106 27.534414 3 0.168909 47.2927 4	seconds 10
0.175829 35.271799 4	8
0.175829 55.271799 4	6
<b>Table 2:</b> 200 points, .1 distance	
	points(in hundreds)
Although my code has doubled in time, it has	This is a plot of the average time stamps for
creased by a minuscule amount, while Mathe- atica's command is taking over four minutes.	graphs ranging from 100-1000 points

inc matica's command is taking over four minutes.

Refining my code, targeting more specific raphs that correlate to finding cliques. Creating a code to find all maximal cliques.



When comparing my time stamps against that <sup>4</sup> Mathematica's command, mine appears to apear almost linear and non-increasing. This shows ow much more dramatically Mathematica's comand takes for the graphs that i tested.

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seconds	300		Î					
	250		$\vdash$			_		
	200					_		
	150	-				_		
	100	-+				_		
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	0 🗹	2	3	4	5	6		
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		points (in hundreds)						

When the graphs I tested had all degrees nging very high, such as in the below table, neier code would produce an answer in a reasonole amount of time.

Size of Degree My Code Mathematica Clique Range

589.13 unfinished no attempt not found 24-91 

 Table 8: 2000 points, .1 distance

Size of Degree My Code Clique Range Mathematica

706.13 unfinished 3-32 21.99 

 Table 9: 2000 points, .05 distance

For a graph of 3,000 points, containing deees from 0-14, my code took only 11.68 seconds find the maximum clique, 3. When the degree nge is increased to a range of 5-42 it took apoximately 112 seconds, finding a 4-clique. Mathnatica's command would take an undetermined mount of time.

For 50 points with degrees ranging from 11the code took 20 secs, a slim difference with athematica's taking 24. Both codes found the ame 10-clique.

My code seems to run fastest when the derees stay reasonable. For 4,000 points, degrees <sup>-</sup>0-6 took 5.37 seconds, mathematica's command as still unfinished at 2234. On a graph of 100 pints, with degrees 4-25, .8 seconds (mathemata: 14.34). Degrees 12-46 took 114 seconds nathematica: 191).

# Future Objectives