# An Efficient Algorithm for Listing Maximal Cliques in Arbitrary Graphs

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#### Abstract

The clique problem has previously been known to be solvable in exponential time (!! CITE BEST KNOWN CASE !!). In this paper, I outline new properties of maximal cliques such that they are able to be enumerated in a worst case of  $\mathcal{O}(|V|^6)$ .

## 1 Introduction

**TBD** 

# 2 New properties of a clique in a given graph

In this section, a series of sets will be described that can be constructed such that they can identify cliques with only set operations on a vertex and it's neighbours. Likewise, the maximum size of every relevant set will be proved for algorithm analysis in a later section.

# 2.1 Preliminary definitions

**Definition 1.** Let G be some graph with vertices V. The set  $\{C_1, C_2, \ldots, C_k\}$  where  $C_i \in V$  is a member of an arbitrary maximal k-clique in G. We call this set C

**Definition 2.** Let  $u \in C$ .  $I_u$  is the set of neighbours of u which are not in C. That is,  $I_u = \{I_{u1}, I_{u2}, \dots, I_{ui}\}$  where  $I_{uj}$  is a neighbour of u such that  $I_u \cap C = \emptyset$ .

Remark. The assumption that C is maximal can be made since C is not constructed; it is just a subset that must exist within the neighbours of some  $u \in V$ . If C is not maximal, we can remove the missing vertices from  $I_u$  and add them to C.

**Definition 3.** Let  $u \in C$ .  $N_u$  are all vertices reachable in at most a single step from u. That is,  $N_u = I_u \cup C$ .

Note. This is different than just all vertices adjacent to u.  $u \in N_u$  since  $u \in C$ . This follows from the definition since u is zero steps from itself.

Corollary 2.1. Let  $u \in V$ .  $|N_u| = deg(u) + 1$ .

Corollary 2.2.  $\forall u \in V, |N_u| \leq |V|$ .

*Remark.* Every vertex in a graph is apart of some clique. This clique may just be  $K_1$  or  $K_2$ , but these are maximal cliques which need to be counted to properly create the list.

# 2.2 Common Neighbours of a Vertex

**Definition 4.** Let  $u \in V$ .  $CN_{ui}$  is the set of vertices in  $N_u$  which u shares with it's i-th neighbour  $N_{ui}$ .

**Definition 5.**  $CN_u$  is the set which lists all neighbours which u has in common with any of it's neighbours. That is, if u can reach a vertex v and some neighbour of u can also reach the vertex v, then v exists within some subset of  $CN_u$ .

We can construct  $CN_u$  by intersecting  $N_u$  with the neighbours of u's i-th neighbour.

$$CN_u = \bigcup_{i=1}^{\deg(u)} \{N_u \cap N_v\}, v = N_{ui}$$
 (1)

**Lemma 2.3.** Let  $u, v \in C$  where  $u \neq v$  and  $I_u \cap I_v = \emptyset$ . Then  $CN_{u_i} \cap CN_{v_j} = C$  for any i, j.

*Proof.* Let  $u, v \in C$  such that  $u \neq v$ , and i, j be some index of  $CN_u, CN_v$ .  $CN_{ui} \cap CN_{vj} = (I_u \cup C) \cap (I_v \cup C)$ . Since  $I_u \cap I_v = \emptyset$ , we can see that the previous statement is equal to  $C = C \cup (I_u \cap I_v) = C \cup \emptyset$ .

Corollary 2.4. For some  $u \in V$ ,  $CN_u$  only contains vertices which u is adjacent to.

Corollary 2.5.  $\forall u \in V, |CN_u| = deg(u)$ 

Corollary 2.6.  $\forall u \in V, |CN_u| \leq |V| - 1$ 

So,  $CN_u$  is a set of neighbours which u has in common with an adjacent vertex v. This set will be used in the next section to create another set which will list all edges which u shares with all of it's neighbours.

### 2.3 Common Edges of a Vertex

**Definition 6.** Let  $u \in V$ .  $CE_{ui}$  is the set of edges in  $N_u$  which u shares with it's i-th neighbour  $N_{ui}$ .

We can construct  $CE_{ui}$  by intersecting  $CN_{ui}$  with the j-th neighbour's common neighbours,  $\forall CN_{(N_{uj})}$ . When we take the union of all of these intersections, we will have constructed  $CE_u$ .

$$e(u, n, i, j) = \begin{cases} CN_{ui} \cap CN_{nj}, n \in N_u, & \text{if } u \in (CN_u \cap CN_n) \\ & \text{and } n \in (CN_u \cap CN_n) \end{cases}$$
(2)

Remark. We do have to check if both vertices are in the resulting intersection. Consider a path graph, and select a vertex, u, not on the ends. Both neighbours of this path graph will attempt to intersect their neighbours  $\neq u$  with u. The resulting set will be the set that only contains the neighbour. This doesn't fit our definition of  $CEu_i$ , so we ignore these values.

**Lemma 2.7.** Equation (2) will be a set that strictly contains vertices that both  $u \in V$  and it's k-th neighbour have an edge to.

Proof. Let  $u \in V$ ,  $E_u = CN_{ui}$  and  $E_v = CN_{vj}$  where  $v = N_{uk}$  for some i, j. Because u and v are neighbours, an edge exists between u and all vertices in  $E_u$  from (2.4). Likewise, the same argument applies for v and  $E_v$ . When we intersect  $E_u \cap E_v$ , the resulting set will be vertices that both u and v have an edge to.

**Definition 7.** Let  $u \in V$ .  $CE_u$  is the set which contains sets of all edges, e(u, n, i, j), which u has in common with all of it's neighbours  $n \in N_u$ .

**Lemma 2.8.** For some  $u \in V$ 

$$CE_{u} = \bigcup_{i=1}^{|CN_{u}|} \bigcup_{k=1}^{|N_{u}|} \{n = N_{uk} \mid \bigcup_{j=1}^{|CN_{n}|} \{e(u, n, i, j)\}\}$$
(3)

*Proof.* Let  $u \in V$ . What this abuse of notation does is: for the *i*-th iteration, we take the *i*-th common neighbour of u and test it against every neighbours common neighbours using the function we defined in (2). So, we will get a set of common edges that both u and every neighbour in  $N_u$  have. This is the definition of  $CE_u$ .

Lemma 2.9. Let  $u \in V$ .  $|CE_u| \leq |V|^3$ 

*Proof.* We know that for any  $u \in V$ ,  $|CN_u| = |V|$  from (2.6). Likewise, the maximum size of  $N_u = |V|$  as well from (2.2). So, (2.8) will take at most  $|V| \cdot |V| \cdot |V| = |V|^3$  intersections to complete, only ever constructing  $|V|^3$  sets that all get unioned into the main  $CE_u$  set.

$$\therefore |CE_u| \le |V|^3.$$

Theorem 2.10.  $u \in C \iff C \in CE_u$ .

Proof of  $u \in C \implies C \in CE_u$ . Let  $u, v \in C$  where  $u \neq v$ .

Note.  $C \in N_u$  and  $C \in N_v$  since u and v are chosen from the same clique.

There are two cases to consider:

Case  $(I_u \text{ has no elements in common with } I_v)$ . So,  $I_u \cap I_v = \emptyset$ .

From (2.3) we know that  $C \in CN_{ui}$  and  $C \in CN_{vj}$ . When we construct  $CE_u$ , we will intersect  $CN_{ui} \cap CN_{vj} = C$ .

 $\therefore C \in CE_u$ .

Case  $(I_u \text{ has at least one element in common with } I_v)$ . not true

Proof of  $u \in C \iff C \in CE_u$ . Let  $u \in V$ . Assume  $C \in CE_u$ , but  $u \notin C$ . Pick  $v \in C$ .

Case  $(v \in N_u)$ . We will pick another  $v \in C$  such that  $v \notin N_u$ . If we cannot pick such a v, that means that C is not maximal, or  $u \in C$ .

Case  $(v \notin N_u)$ . From (2.4),  $\forall i \leq CN_u, v \notin CN_{ui}$ . However, for  $C \in CE_u$ , we must intersect  $CN_u$  with one of it's neighbours  $CN_{N_u}$  so that C is created. But since v is not in  $CN_u$  at all, we would be missing v, so  $(C \setminus v) \in CE_u$ . This is a contradiction that  $C \in CE_u$ .

 $\therefore$  u must have an edge to v. However, if we create this edge, then  $u \in C$ . From the two cases, we see if  $C \in CE_u$  then  $u \in C$ .

 $CE_u$  is the set which lists all edges which u has in common with all of it's neighbours. That is, if u has an edge to vertex v and some neighbour of u also has an edge to the vertex v, then v exists within some subset of  $CE_u$ . We know that  $CE_u$ 's length is bounded by a polynomial (2.9), and that only vertices in a clique C will contain  $C \in CE_u$ . Using these facts, in the next section we will develop an algorithm to list all cliques in a graph.

# 3 An algorithm to list maximal cliques in an arbitrary graph

In this section I will present an algorithm in multiple parts which, when combined, will list all maximal cliques in an arbitrary graph.

# 3.1 Algorithm

### Algorithm 3.1: Create Common Neighbour Set

```
function: list_common_neighbours
            input: Set of vertices V, Set of tuples (v_i, v_j) called E output: Set of common neighbours
 2
 3
 4
            begin
 5
                  edge\_reports \leftarrow \{\}
 6
                  for v in V
                        neighbours \leftarrow adjacent \ vertices \ of \ v
                         for n in neighbours
 9
                               \texttt{edge} \; \leftarrow \; \texttt{the} \; \; \texttt{edge} \; \; (v,n) \in E
10
                               if edge in edge_reports
                                     \texttt{edge\_reports[edge][2]} \; \leftarrow \; \texttt{neighbours}
11
                                     \texttt{edge\_reports[edge]} \; \leftarrow \; \{\texttt{neighbours}\,, \emptyset\}
13
                               end
15
                         end
17
                  common_neighbours = {}
19
                  for edge in E
                         ce \leftarrow edge\_reports[edge][1] \cap edge\_reports[edge][2]
20
                        add ce to set common_neighbours[edge[1]] add ce to set common_neighbours[edge[2]]
25
                  return common_neighbours
```

### Algorithm 3.2: Create Common Edge Set

```
function: list_common_edges
1
         input: Set of vertices V, Set of tuples (v_i, v_j) called E
2
          output: Set of common edges
3
          begin
4
              common\_neighbours \leftarrow common\_neighbours(V, E)
5
              common\_edges \leftarrow \{\}
6
              for u in V
                    for v in neighbour vertices of u
9
                          \  \, \text{for Ucn} \  \, in \  \, \text{common\_neighbours[u]} \\
10
                              for Vcn in common_neighbours[v]
let ce = Ucn \cap Vcn
11
12
                                   ifu in ce and v in ce
13
                                        add ce to set common_edges[u]
14
                                   end
15
                              end
16
                        end
17
                   end
18
              end
19
20
21
              return common_edges
22
         end
```

### Algorithm 3.3: List Maximal Cliques

```
\begin{array}{lll} & \textit{function} \colon \text{list\_maximal\_cliques} \\ & \textit{input} \colon \text{Set of vertices V}, \text{ Set of tuples } (v_i, v_j) \text{ called E} \\ & \textit{output} \colon \text{Set of maximal cliques } \textit{in the graph } (V, E) \\ & \textit{begin} \\ & \text{common\_edges} \leftarrow \text{common\_edges}(V, E) \end{array}
```

```
\begin{array}{l} \text{cliques} \; \leftarrow \; \{\} \\ \text{for u } \; in \; \text{V} \\ \text{for Uce } \; in \; \text{common\_edges[u]} \end{array}
7
9
                                   \texttt{clique} \; \leftarrow \; \{u\}
10
                                   for n in neighbours of V
11
                                          if Uce ∈ common.edges[n]
add n to clique
remove Uce from common_edges[n]
12
13
14
                                          end
15
16
                                   end
17
                                  add clique to cliques remove Uce from common_edges[n]
18
19
                            end
20
                    end
^{21}
22
                     // Remove sub-cliques so we are left with only maximal
23
24
                    for c1 in cliques
                            for c2 in cliques if c1 \subset c2
^{25}
26
                                          remove c1 from cliques
27
                                   end
28
                            end
29
                    end
30
31
                     return cliques
32
```

Remark. The reason non-maximal cliques exist is that the properties listed in the previous section show that the maximal clique must exist, but are not necessarially exclusive, in CE. Using the algorithm as described, it will never misreport a clique since

# 4 Conclusion

Corollary 4.1. P = NP

*Proof.* Proof is left as an exercise to the reader.