Generalization of the Consecutive-ones Property ^{c1}

c1 fyi: Synopsi title is "Generalization of Consecutive Ones Property of Binary Matrices"

A THESIS

submitted by

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CHAPTER 2

Consecutive-ones Property – A Survey of Important Results

This chapter surveys several results that are significant to this thesis or to COP in general. These predominantly pertain to characterizations of COP, algorithmic tests to check for COP (COT), optimization problems on binary matrices that do not have COP and some applications of COP.

c1

c1 important: A have a few lines about organization of chapter

2.1 COP in Graph Theory

COP is closely connected to several types of graphs by way of describing certain combinatorial graph properties. There are also certain graphs, like convex bipartite graphs, that are defined solely by some of its associated matrix having COP. In this section we will see the relevance of consecutive-ones property to graphs. To see this we introduce certain binary matrices that are used to define graphs in different ways. While adjacency matrix is perhaps the most commonly used such matrix, Definition 2.1.1 defines this and a few more.

Definition 2.1.1. Matrices that define graphs. [Dom08, Def. 2.4]. Let G and H be defined as follows. $G = (V, E_G)$ is a graph with vertex set $V = \{v_i \mid i \in [n]\}$ and edge set $E_G \subseteq \{(v_i, v_j) \mid i, j \in [n]\}$ such that $|E_G| = m$. $H = (A, B, E_H)$ is a bipartite graph with partitions $A = \{a_i \mid i \in [n_a]\}$ and $B = \{b_i \mid i \in [n_b]\}$.

- 2.1.1-i. Adjacency matrix of G is the symmetric $n \times n$ binary matrix M with $m_{i,j} = 1$ if and only if $(v_i, v_j) \in E_G$ for all $i, j \in [n]$.
- 2.1.1-ii. Augmented adjacency matrix of G is obtained from its adjacency matrix by setting all main diagonal elements to $\mathbf{1}$, i. e. $m_{i,i} = \mathbf{1}$ for all $i \in [n]$.
- 2.1.1-iii. Maximal clique matrix or vertex-clique incidence matrix of G is the $n \times k$ binary matrix M with $m_{i,j} = \mathbf{1}$ if and only if $v_i \in C_j$ for all $i \in [n], j \in [k]$ where $\{C_j \mid j \in [k]\}$ is the set of maximal cliques of G.
- 2.1.1-iv. Half adjacency matrix of H is the $n_a \times n_b$ binary matrix M with $m_{i,j} = \mathbf{1}$ if and only if $(a_i, b_j) \in E_H$.

Now we will see in Definition 2.1.2 certain graph classes that is related to COP or CROP.

Definition 2.1.2. Graphs that relate to COP.[Dom08, Def. 2.5] Let G be a graph and H be a bipartite graph.

- 2.1.2-i. G is convex-round if its adjacency matrix has the CROP.
- 2.1.2-ii. G is concave-round if its augmented adjacency matrix has CROP. c1 c2

c1 cite BHY00

2.1.2–iii. G is an *interval graph* if its vertices can be mapped to intervals on the real line such that two vertices are adjacent if and only if their corresponding intervals overlap $^{\rm c3}$. G is an interval graph if and only if its maximal clique matrix has COP [FG65] $^{\rm c3}$

c2 minor: add CROP to glossary

c3 cite Ben59, Haj57

- a. G is a unit interval graph if it is an interval graph such that all intervals have the same length.^{c3}
- b. G is a proper interval graph if it is an interval graph such that no interval properly contains another. $^{\rm c3}$ $^{\rm c4}$

c4 cite rob69,gar07 in footnote. pg 33 dom

2.1.2–iv. G is a *circular-arc graph* if its vertices can be mapped to a set of arcs on a circle such that two vertices are adjacent if and only if their corresponding arcs overlap.^{c5}

c5 pressing: how is CO/ROP related?

- 2.1.2-v. *H* is *convex bipartite on columns (rows)* if its half adjacency matrix has COP on rows (columns).
- 2.1.2-vi. *H* is *biconvex bipartite* or *doubly convex*[YC95] if its half adjacency matrix has COP on both rows and columns.
- 2.1.2-vii. H is circular convex if its half adjacency matrix has CROP.

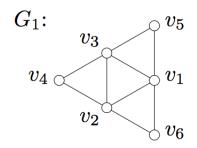
Interval graphs^{c5} and circular-arc graphs have a long history in research. The interest around them is due to their very desirable property that several problems that are NP-hard ^{c6} on general graphs, like finding a maximum clique or minimum

c6 minor: all NPC problems are NPH yes?

c3This follows [GH64] which states that the maximal cliques of interval graph G can be linearly ordered such that for all $v \in V(G)$, cliques containing v are consecutive in the ordering [Gol04, Th. 8.1].

 $^{^{\}rm c3}$ The set of unit interval graphs and the set of proper interval graphs are the same

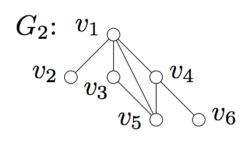
^{c5}[McC04] cites that the problem of recognizing interval graphs has significance in molecular biology. Interestingly, in the late 1950s, before the structure of DNA was well-understood, Seymour Benzer was able to show that the intersection graph of a large number of fragments of genetic material was an interval graph [Ben59]. This was regarded as compelling evidence that genetic information was somehow arranged inside a structure that had a linear topology which we now know to be true from the discovery of linear structure of DNA.



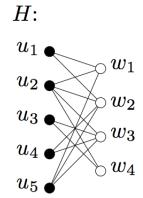
$\mathbf{A_2}$	v_1	v_2	v_3	v_4	v_5	v_6
v_1	1	1	1	0	1	1
v_2	1	1	1	1	0	1
v_3	1	1	1	1	1	0
v_4	0	1	1	1	0	0
v_5	1	0	1	0	1	0
v_6	1	1	0	0	0	1

$\mathbf{A_1}$	v_1	v_2	v_3	v_4	v_5	v_6
v_1	0	1	1	0	1	1
v_2	1	0	1	1	0	1
v_3	1	1	0	1	1	0
v_4	0	1	1	0	0	0
v_5	1	0	1	0	0	0
v_6	1	1	0	0	0	0

$\mathbf{A_2'}$	v_1	v_6	v_2	v_4	v_3	v_5
v_1	1	1	1	0	1	1
v_6	1	1	1	0	0	0
v_2	1	1	1	1	1	0
v_4	0	0	1	1	1	0
v_3	1	0	1	1	1	1
v_5	1	0	0	0	1	1



\mathbf{B}	c_1	c_2	c_3	c_4
v_1	1	1	1	0
v_2	1	0	0	0
v_3	0	1	0	0
v_4	0	0	1	1
v_5	0	1	1	0
v_6	0	0	0	1



C	w_1	w_2	w_3	w_4
u_1	1	1	0	0
u_2	1	1	1	1
u_3	0	0	1	1
u_4	0	1	1	0
u_5	1	1	1	0

Figure 2.1: A_1 is the adjacency matrix and A_2 is the augmented adjacency matrix of G_1 . A_2' is obtained from A_2 by permuting its rows and columns to achieve CROP order, i. e. A_2 has CROP – thus G_1 is a concave-round graph (Def. 2.1.2 ii) and a circular-arc graph (Tab. 2.1) B is the maximal clique matrix of G_2 and has COP – thus G_2 is an interval graph(Def. 2.1.2 ii). C is the half adjacency matrix of bipartite graph H and has COP on rows – thus H is a convex bipartite graph. – PLACEHOLDER IMAGES –

coloring or independent set, are polynomial time solvable in these graph classes [CLRS01]. In a similar fashion, a lot of problems that are hard on general matrices have efficient solutions on matrices with COP or CROP [Dom08, more citations pg. 33].

Table 2.1 summarises the way these graphs are characterized by their matrices having COP or CROP. Our focus in this chapter (and thesis) is mainly COP and having seen how useful COP is in identifying or characterizing many types of graphs^{c0}, we will now see results that study recognition of COP in matrices in the following section.

tab 2.1 - have an abridged version of table 2.1 in dom. see notes for the possibility of a "circle diagram".

Table 2.1: Graph matrices PLACEHOLDER

2.2 Matrices with COP

The most important questions with respect to a particular property desired in a structure/object are perhaps the following.

- Does the desired property exist in the given input?
- If the test is affirmative, what is a certificate of the affirmative?
- If the test is negative, what are the optimization possibilities for the property in the input? In other words, how close to having the property can the input be?
- If the test is negative, what is a certificate of the negative?

In this section and the rest of the chapter we see results that shaped the corresponding areas respectively for consecutive-ones property in binary matrices.

- a. Does a given binary matrix have COP?
- b. What is the COP permutation for the given matrix with COP?
- c. What are the optimizations possible and practically useful on the given matrix without COP?
- d. If algorithm for (a) returns **false**, can a certificate for this be computed?

^{c0}COP has several other applications fill up.

Without doubt, besides computing answers to these questions, we are interested in the efficiency of these computations in terms of computational complexity theory. Results towards questions (a) and (b) are surveyed in this section. Those for question (c) are discussed in Section 2.3 and question (d) is discussed in Section 2.2.3.

It may be noted that one way to design an algorithm to test for COP is by deriving one from any interval graph recognition algorithm using the result HMPV00^{c1} c² [Dom08] which demonstrates how such a derivation can be done. However, this does not necessarily yield an efficient algorithm. We will see results that directly solve the problem on matrices since it is known that questions (a) and (b) stated above for COP are efficiently solvable. Table 2.2 gives a snapshot of these results.

cl cite

c2 in footnote put the theorem 2.7 dom pg 43

c3 important: 18 by petrie – cite kendall 69 pacific journal of mathematics 1969

c3

1899	First mention of COP (archaeology)	
1951	Heuristics for COT	[Rob51]
1965	First polynomial time algorithm for COP testing	[FG65]
1972	Characterization for COP- forbidden submatrices	[Tuc72]
1976	First linear time algorithm for COT – PQ -tree	[BL76]
1992	Linear time algorithm COT without PQ -tree	[Hsu02]
2001	PC-tree – a simplification of PQ -tree	[Hsu01, HM03]
1996	PQR-tree – generalization of PQ -tree for any binary matrix regard-	[MM96]
	less of its COP status	
1998	Almost linear time to construct PQR -tree	[MPT98]
2004	A certifying algorithm for no COP.	[McC04]
	Generalized PQ -tree.	
2009	Set theoretic, cardinality based characterization of COP – ICPIA	[NS09]
2010	Logspace COP testing	[KKLV10]

Table 2.2: A brief history of COP research

The first polynomial time algorithm for COP testing was by [FG65] which uses overlapping properties of columns with 1s. Their result has close relations to the characterization of interval graphs by [GH64]. A graph G is an interval graph if and only if all its maximal cliques can be linearly ordered such that for any vertex v in G, all the cliques that v is incident on are consecutive in this order. Clearly, this means that the maximal clique incidence matrix^{c3} must have COP on rows.

A few years later, a deeply significant result based on very different ideas in understanding COP came from Tucker which gave a combinatorial (negative) characterization of matrices with COP [Tuc72]. This result influenced most of the COP results that followed in the literature including linear time algorithms^{c4} for COP recognition.

c4 pressing: line did it? which ones?

c3 Definition 2.1.1 iii

2.2.1 Tucker's forbidden submatrices for COP

[Tuc72] discovered certain forbidden structures for convex bipartite graphs^{c4} and by definition of this graph class, this translates to a set of forbidden submatrices for matrices with consecutive-ones property. The following are the theorems from [Tuc72] that acheived this characterization.

Theorem 2.2.1 states that convex bipartite graphs cannot have asteroidal triples^{c0} contained in the corresponding vertex partition^{c0}. Theorem 2.2.2 lists the structures in a bipartite graph that force one of its vertex partitions to have asteriodal triples – in other words, it identifies the subgraphs that prevent the graph from being convex bipartite.

Theorem 2.2.1. ([Tuc72, Th. 6], [Dom08, Th. 2.3])

A bipartite graph $G = (V_1, V_2, E)$ is convex bipartite on columns^{c0} if and only if V_1 contains no asteroidal triple of G.

Theorem 2.2.2. ([Tuc72, Th. 7], [Dom08, Th. 2.4])

In a bipartite graph $G = (V_1, V_2, E)$ the vertex set V_1 contains no asteroidal triple if and only if G contains none of the graphs G_{I_k} , G_{II_k} , G_{III_k} (with $k \ge 1$), G_{IV} , G_V as shown in Figure 2.2 as subgraphs.

Theorem 2.2.1 and Theorem 2.2.2 result in the following Theorem 2.2.3 which characterizes matrices with COP.

Theorem 2.2.3. ([Tuc72, Th. 9], [Dom08, Th. 2.5])

A matrix M has COP if and only if it contains none of the matrices M_{I_k} , M_{II_k} , M_{III_k} (with $k \ge 1$), M_{IV} , M_V as shown in Figure 2.3 as submatrices.

It can be verified that the matrices in Figure 2.3 are the half adjacency matrices of the graphs in Figure 2.2 respectively which is not surprising due to Definition 2.1.2 v.

^{c4}The terminology in [Tuc72] differs. It uses the term graphs with V_1 -consecutive arragement instead of convex bipartite graphs.

 $^{^{}c0}$ If G = (V, E) is a graph, a set of three vertices from V form an asteroidal triple if between any two of them there exists a path in G that does not contain any vertex from the closed neighborhood of the third vertex.

^{c0}The partition corresponds to columns (rows) if its half adjacency matrix has COP columns (rows).

^{c0}Abridged to match terminology adopted in this document. See previous note.

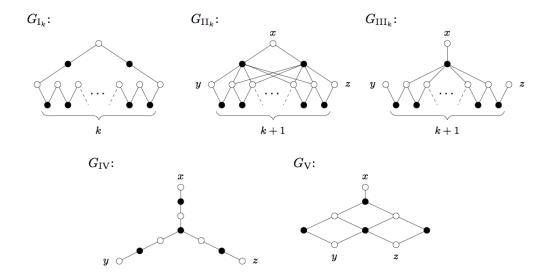


Figure 2.2: Tucker's forbidden subgraphs for convex bipartite graphs. PLACEHOLDER IMG

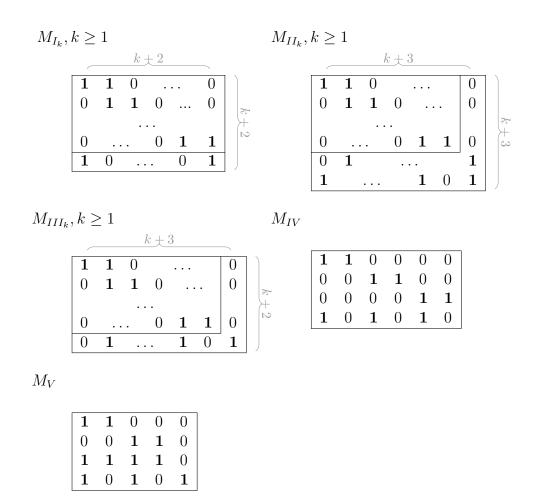


Figure 2.3: Tucker's forbidden submatrices for convex bipartite graphs. [Tuc72]

2.2.2 Booth and Lueker's PQ tree – a linear COT algorithm

Booth and Lueker in their paper [BL76] gave the first linear algorithm of consecutive-ones property testing while given a linear time interval graph recognition algorithm by a simplification of c1's planarity test algorithm. [BL76] introduces a data structure called PQ-tree and their COP testing algorithm is a constructive one that outputs a PQ-tree if the input has COP. A PQ-tree represents all the COP orderings of the matrix it is associated with. [BL76]'s algorithm uses the fact that if a matrix has COP, a PQ-tree for it can be constructed. It is interesting to note that aside from interval graph recognition and COP testing, PQ-tree is also useful in other applications like finding planar embeddings of planar graphs [?, McC04] and recognizing CROP in a matrix.

c1 cite - A.
Lempel, S.
Even and I.
Cederbaum,
An Algorithm
for Planarity
Testing of
Graphs,
Theory of
Graphs, ed.,
P. Rosenstiehl,
Gordon and
Breach, New
York, (1967),
215,232

Definition 2.2.1 (PQ-tree [BL76, McC04]). A PQ-tree of matrix M with COP on columns (rows), is a tree with the following properties.

- i. Each leaf uniquely represents a row (column) of M. The leaf order of the tree gives a COP order for column (row)^{c0} for M.
- ii. Every non-leaf node in the tree is labeled P or Q.
- iii. The children of P nodes are unordered. They can be permuted in any fashion to obtain a new COP order for M.
- iv. The children of Q nodes are linearly ordered. Their order can be reversed to obtain a new COP order for M.

See Figure 2.4 for an example of PQ-tree. It may be noted that there is no way an empty set of COP orderings can be represented in this data structure. For this reason, PQ-tree is undefined for matrices that do not have COP. Thus effectively, there exists a bijection between set of matrices with COP and the set of PQ-trees (accurately speaking, each matrix with COP bijectively maps to an equivalence class of PQ-trees resulting from properties (iii) and (iv)).

The [BL76] algorithm with input $n \times m$ matrix M starts with a PQ-tree for a vacuous $n \times 0$ matrix M' (submatrix induced by 0 columns). This is known as a universal PQ-tree which is one with its root as a P node and only leaves as its children – each leaf representative of a row of input (by definition of COP for

Time complexity is O(m+n+f) where $m \times n$ is the order of the input matrix and f is the number of 1s in it.

^{c0}Note that COP order for column requires permutation of rows and vice versa.

r_1	1	0	1	0	0	0	0
r_2	1	0	1	0	0	0	0
r_3	1	0	0	1	0	0	0
r_4	1	0	0	1	0	0	0
r_5	1	0	0	0	0	0	0
r_6	1	1	0	0	0	0	0
r_7	0	1	0	0	0	1	0
r_8	0	1	0	0	1	1	0
r_9	0	1	0	0	1	1	0
r_{10}	0	1	0	0	1	1	1
r_{11}	0	1	0	0	1	0	1

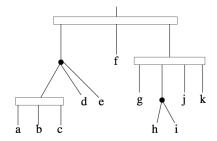


Figure 2.4: An example for PQ-tree. Permuting the order of the left child of the root, we see that (d,a,b,c,e,f,g,h,i,j,k) is a COP order. Reversing the order of the right child of the root, we see that (a,b,c,d,e,f,k,j,h,i,g) is yet another COP order. PLACEHOLDER IMG. [McC04, Fig. 1¹⁰]

columns). This induced submatrix M' vacuously has COP. Each column is then added iteratively to M' to check if the new M' has COP. By a complicated, but linear, procedure the algorithm does one of the following actions in each iteration: (a) declare that M has no COP, or (b) modify the current PQ-tree to represent the new M' (which clearly, must have COP, since if not, option (a) would have been executed).

Judging from notes in literature, this algorithm is apparently notoriously difficult to program. In the procedure to modify the PQ-tree at each iteration, nodes are considered from leaves to tree. At each node considered, it uses one of nine templates to determine how the tree must be altered in the vicinity of this node. Recognition of this template poses a difficult challenge in terms of implementing it. Each template is actually a representative of a larger class of similar templates, which must be dealt with explicitly by a program [McC04].

After the invention of PQ-trees, presumably due to the implementation challenge it posed, there has been several variants of the same in the literature, like PC-tree [SH99, Hsu01, HM03], generalized PQ-tree [KM89, McC04], PQR-tree [MM96, MPT98] etc. Most of these are generalizations of PQ-tree—for instance, PC-tree is generalized to matrices with CROP, PQR-tree and generalized PQ-tree are generalized to matrices and set systems with or without COP. [KM89] invented a modified form of PQ-tree a simpler incremental update of the tree only for recognizing interval graphs. [KR88] constructed efficient parallel algorithms for manipulating PQ trees. dom chapter 2 pg 40 Variations of PQ-trees first para - summarize.

In the next few following sections we will see some of these variations.

2.2.3 PQR-tree – COP for set systems

Section 1.6 mentions how a binary matrix naturally maps to a system of sets. A set can be constructed for each column of matrix with its elements being those row indices at which the column has 1s. Thus the collection of sets corresponding each column of the matrix forms a set system with universe as the set of all row indices of the matrix. This simple construction is formally described in Definition 2.2.2 along with the idea of consecutive-ones property for set systems^{c0}.

Definition 2.2.2. Consecutive-ones property for set systemsLet M be a binary matrix of order $n \times m$ and $\{c_i \mid i \in [m]\}$ be the columns in M. A set system $\mathcal{F}_M = \{S_i \mid S_i \subseteq a\}$ $[n], i \in [m]$ is defined such that for every column c_i of M, set $S_i = \{j \mid m_{ji} = 1\}$. The collection \mathcal{F}_M is the set system of binary matrix M.

A set system \mathcal{F} from universe $U = \{1, 2, \dots, n\}$ has the consecutive-ones property if it is possible to assign a linear order, i.e. a permutation $\sigma = u_1 u_2 \dots u_n$ to U such that each set $S \in \mathcal{F}$ appears as a consecutive subsequence $u_i u_{i+1} \dots u_{i+k-1}$ (also called an interval) of λ in the linear order, where positive integers k = |S| and $i \le n + 1 - k$.

It is easy to see the equivalence of this definition to COP for matrices in Definition 1.3.3.

Generalized PQ-tree or gPQ-tree is a data structure defined in [Nov89] to represent all orthogonal sets of a set system \mathcal{F} . Orthogonal sets of \mathcal{F} are sets that do not overlap with any set in \mathcal{F} . A data structure with the same name was later defined in [McC04] as part of a substitution decomposition for a set system \mathcal{F} . c1 define This is later used to define a certificate if \mathcal{F} has no COP. PQR-tree is a data structure defined in [MM96] as a data structure to represent any set system \mathcal{F} with additional information in their R-nodes if \mathcal{F} has no COP. All three of these data structures are proposed as generalizations of [BL76]'s PQ-tree and hence produce the PQ-tree if \mathcal{F} has COP. As a whole, all these three data strutures are near-identical with their differences being notional. In this section, we will discuss the basic theory that they all hold and stick to the name of the data structure as PQR-tree.

A PQR-tree of a given set system \mathcal{F} from universe U represents all the sets from 2^U that have trivial intersections with every set in \mathcal{F} . Two sets A and B

 $^{^{\}rm c0}{\rm As}$ seen in Section 1.2.1

are said to have a trivial intersection if $A \cap B$ is one of the following $-\emptyset$, A or B. In other words, A and B are either (i) disjoint or (ii) one is the subset of the other. Such sets are also called orthogonal sets or said that A is orthogonal to B. Trivial subsets of a universe U, denoted by $\mathcal{T}(U)$, are sets that have trivial intersections with any set in 2^U . Namely, $\mathcal{T}(U)$ consists of U, singleton sets in 2^U and \emptyset [Nov89, MM96]. In other words, the all sets presented in a PQR-tree share the property that they do not overlap with any set in \mathcal{F} . We will now see how this helps in testing for COP in \mathcal{F} .

An important observation made by [MM96] is that if \mathcal{F} is a set system with COP then, aside from every set in \mathcal{F} being consecutive (after applying the COP order) the following sets must also be consecutive for any $A, B \in \mathcal{F}$.

- 1. The intersection $A \cap B$
- 2. The union $A \cup B$ if $A \cap B \neq \emptyset$
- 3. The relative complements $A \setminus B$ and $B \setminus A$ if $B \nsubseteq A$ and $A \nsubseteq B$ respectively.

Also note that trivially, sets in $\mathcal{T}(U)$ are consecutive in any permutation of U^{c0} .

Any set system that is closed under the above operations and contains $\mathcal{T}(U)$ is called *complete* [MM96] or a *weakly partative family* [McC04]. Such a set system is easier to work with for reasons that will become apparent. c1 For any set system \mathcal{F} , c1 $_{VAGUe!}$ the smallest super set system that is complete/weakly partative is called the weak closure of \mathcal{F} , denoted $\mathcal{W}(\mathcal{F})$ [McC04, Def. 3.2]. [MM96, Def. 2, smallest complete supercollection].

What is interesting is that the set of COP permutations of \mathcal{F} is the same as that of $\mathcal{W}(\mathcal{F})$ [MM96, Th. 3]. The reason this is interesting is because it becomes apparent by this theory that it is easier to use $\mathcal{W}(\mathcal{F})$ to create the PQR-tree for \mathcal{F} .

The generalized PQ-tree of \mathcal{F} is defined as the decomposition tree of its weak closure $\mathcal{W}(\mathcal{F})$. Decomposition tree is the inclusion tree (inclusion p.o. Hasse diagram) of the strong elements of $\mathcal{W}(\mathcal{F})$ with labels prime, linear and degenerate. [McC04]

Overlap components are computable in linear time [MM95, Hsu92].

Certifying algorithm (Generalized PQ trees) [McC04] -

Set theoretic characterizations [Hsu02, NS09] [Hsu02] describes the simpler algorithm for COT.c2

[NS09] describes a characterization of consecutive-ones property solely based on the cardinality

c2 pressing: in

 $^{^{}c0}\emptyset$ is considered consecutive by convention.

properties of the set representations of the columns (rows); every column (row) is equivalent to a set that has the row (column) indices of the rows (columns) that have one entries in this column (row). This is interesting and relevant, especially to this thesis because it simplifies COT to a great degree by reducing the solution search space owing to the a simple set theoretic characterization.

[McC04] describes a different approach to COT. While all previous COT algorithms gave the COP order if the matrix has the property but exited stating negative if otherwise, this algorithm gives an evidence by way of a certificate of matrix even when it has no COP. This enables a user to verify the algorithm's result even when the answer is negative. This is significant from an implementation perspective because automated program verification is hard and manual verification is more viable. Hence having a certificate reinforces an implementation's credibility. Note that when the matrix has COP, the COP order is the certificate. The internal machinery of this algorithm is related to the weighted betweenness problem addressed^{c1} in [COR98]. c2

$^{\rm c1}_{\substack{\rm in \ what\\ \rm way??}}$

c2 expand on the COP order graph creation and it having to be bipartite for M to have COP. and thus an odd cycle being an evidence of no COP.

2.2.4 PC-tree—a generalization of PQ-tree

PC-tree is a generalization of PQ-tree. It is a data structure that is analogous to PQ-tree but for matrices with circular-ones property. PC-tree was introduced by [SH99] for the purpose of planarity testing where this data structure represents partial embeddings of planar graphs. In [Hsu01], Hsu reintroduces PC-tree as a generalization of PQ-tree and shows how it simplifies [BL76]'s planarity test by making the PQ-tree construction much less complicated. Later [HM03], discovers that PC-tree is a representation of all circular-ones property orders of a matrix when it is unrooted. PC-tree presented in [Hsu01] is rooted; however the construction of PC-tree is the same in both results. The property of being unrooted is necessary in order to use PC-tree as a data structure for encoding circular ordering. Definition 2.2.3 defines PC-tree.

Definition 2.2.3.[PC-tree [Hsu01, Dom08].] A PC-tree of matrix M with CROP on columns (rows), is a tree with the following properties.

- i. Is unrooted thus it has (a) no parent child relationship between nodes (b) there is no left to right (or vice versa) ordering.
- ii. Each leaf uniquely represents a row (column) of M. The leaf order of the tree gives a CROP order for column (row) for M. Moreover, any sequence obtained by considering the leaves in clockwise or counter-clockwise order describes a CROP order for M.
- iii. Every non-leaf node in the tree is labeled P or C.
- iv. The neighbors of P nodes can be permuted in any fashion to obtain a new CROP order for M.
- v. The tree can be changed by applying the following "mirroring" operation to obtain a new CROP order for M. Root the PC-tree at a neighbor of a C-node, v and mirror the subtree whose root is v and finally unrooting the tree. Mirroring a subtree is done by putting the children of every node of the subtree in reverse order.

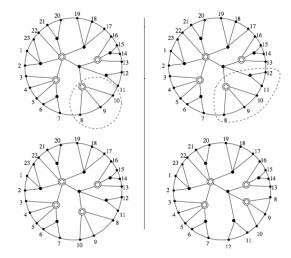


Figure 2: The PC tree can be viewed as a gadget for generating the circular-ones permutations of the columns. The C nodes are represented by double circles and the P nodes are represented by black dots. The subtree lying at one side of an edge can be flipped over to reverse the order of its leaves. The order of leaves of a consecutive set of subtrees that would result from the removal of a P node can also be reversed. All circular-ones arrangements can be obtained by a sequence of such reversals.

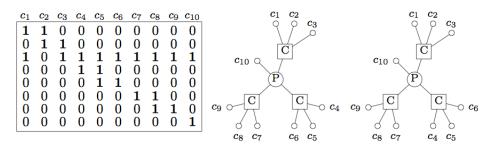


Figure 2.5: PC-tree PLACEHOLDER IMGS [HM03, Dom08]

As a data structure when PC-tree is compared with PQ-tree, the differences are, (i) it is unrooted, (ii) it represents all CROP order of a matrix (iii) it has C nodes instead of Q nodes which can be "mirrored" (operation defined in Definition 2.2.3 v). The algorithms of construction of PQ-tree in [BL76] and that of PC-tree in [Hsu01, HM03] starkly differ since the latter is a much simplified procedure.

2.3 Optimization problems in COP

c1

c1 Expand on

So far we have been concerned about matrices that have the consecutive ones property. However in real life applications, it is rare that data sets represented by binary matrices have COP, primarily due to the noisy nature of data available. At the same time, COP is not arbitrary and is a desirable property in practical data representation [COR98, JKC+04, Kou77]. In this context, there are several interesting problems when a matrix does not have COP but is "close" to having COP or is allowed to be altered to have COP. These are the optimization problems related to a matrix which does not have COP. Some of the significant problems are surveyed in this section.

 $^{\mathrm{c2c3}}$ couple of lines referring to tucker's submatrices. refer earlier section.

Once a matrix has been detected to not have COP (using any of the COT algorithms mentioned earlier), it is naturally of interest

- 1. to find out the smallest forbidden substructure (in terms of number of rows and/or columns and/or number of entries that are 1s). [Dom08] discusses a couple of algorithms which are efficient if the number of 1s in a row is small. This is of significance in the case of sparse matrices where this number is much lesser than the number of columns.
- 2. $(*, \Delta)$ -matrices are matrices with no restriction on number of 1s in any column but has at most Δ 1s in any row. MIN COS-R (MIN COS-C), MAX COS-R (MAX COS-C) are similar problems which deals with inducing COP on a matrix.
 - (a) In the dual problem MAX COS-R (MAX COS-C) the search is for the maximum number of rows (columns) that induces a submatrix with COP.
 - (b) In MIN COS-R (MIN COS-C) the question is to find the minimum number of rows (columns) that must be deleted to result in a matrix with COP.

Given a matrix M with no COP, [Boo75] shows that finding a submatrix M' with all columns^{c4} but a maximum cardinality subset of rows such that M' has COP is NP complete. [HG02] corrects an error of the abridged proof of this reduction as given in [GJ79]. [Dom08] discusses all these problems in detail giving an extensive survey of the previously existing results which are almost exhaustively all approximation results and hardness results. Taking this further, [Dom08] presents new results in the area of parameterized algorithms for this problem^{c5}

- 3. Another problem is to find the minimum number of entries in the matrix that can be toggled to result in a matrix with COP. [Vel85] discusses approximation of COP Aug-MENTATION which is the problem of changing of the minimum number of zero entries to 1s so that the resulting matrix has COP. As mentioned earlier, this problem is known to be NP complete due to [Boo75]. [Vel85] also proves, using a reduction to the longest path problem, c6 that finding a Tucker's forbidden submatrix of at least k rows is NP complete. c7 c8
- 4. [JKC⁺04] discusses the use of matrices with almost-COP (instead of one block of consecutive 1s, they have x blocks, or runs, of consecutive 1s and x is not too large) in the storage of very large databases. The problem is that of reordering of a binary matrix such that the resulting matrix has at most k runs of 1s. This is proved to be NP hard using a reduction from the Hamiltonian path problem.^{c9} c10c11 c12 c13

- c2 sect 4.1 in cite:d08phd has many results surveyed. hardness results, approx. results. results are usually for a class of matrices (a,b) where number 1s in columns and rows are restricted to a and b. problem of flipping at most k entries of M to make it attain COP. this is NP complete cite:b75-phd
- c3 (1) scite:lb62 showed that interval graphs are chordal and AT-free.
- c4 check if b75 deals with COP col or COP row. also is it any submatrix with k less than r rows or submatrix must have all columns?
- c5 elaborate what are the results?
- or is it a survey of another result? check.
- how is this different from booth's 75 result??
- c8 where should this go? cite—tz04 (approx submatrix with COP sparse matrices)
- c9 Theorem 2.1 in jkckv
- c10 (1) A

connection of

2.4 COP in Graph Isomorphism

c14 c15

c1

The survey from kklv10 conclusion.

c14 Expand on sec:appgraphiso

 $\begin{array}{c} \text{c15} \\ \text{(canonization} \\ \text{theme)} \end{array}$

c1 pressing: ADI peo exists iff chordal. lexicographic BFS [tag:chordalGraph]

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