



On Low Treewidth Graphs and Supertrees

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Abstract

Compatibility of unrooted phylogenetic trees is a well studied problem in phylogenetics. It asks to determine whether for a set of k input trees T_1, \dots, T_k there exists a larger tree (called a supertree) that contains the topologies of all k input trees. When any such supertree exists we call the instance compatible and otherwise incompatible. It is known that the problem is NP-hard and FPT, although a constructive FPT algorithm is not known. It has been shown that whenever the treewidth of an auxiliary structure known as the display graph is strictly larger than the number of input trees, the instance is incompatible. Here we show that whenever the treewidth of the display graph is at most 2, the instance is compatible. Furthermore, we give a polynomial-time algorithm to construct a supertree in this case. Finally, we demonstrate both compatible and incompatible instances that have display graphs with treewidth 3, highlighting that the treewidth of the display graph is (on its own) not sufficient to determine compatibility.

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1 Introduction

One of the central challenges within computational evolutionary biology is to infer the evolutionary history of a set of contemporary species (or more generally, *taxa*) X using only the genotype of the contemporary species. This evolutionary history is usually modeled as a *phylogenetic tree*, essentially a tree in which the leaves are bijectively labeled by the elements of X and the internal nodes of the tree represent (hypothetical) ancestors [14].

There is already an extensive literature available on the extent to which different optimization criteria on the space of phylogenetic trees (e.g. likelihood, parsimony) are able to identify the “true” evolutionary history. In any case it is well-known that most of these problems are NP-hard, and this intractability is a serious obstacle when constructing phylogenetic trees for large numbers of taxa. This has been one of the motivations behind *supertree* methods [3]. Here the goal is to first construct phylogenetic trees for small (overlapping) subsets of X and then to puzzle the partial trees together into a single tree on X that contains all the topologies of the partial trees, in which case we say the partial trees are *compatible*, or to conclude that no such tree exists.

The computational complexity landscape of the compatibility problem is uneven. In the case that all the partial trees are rooted (i.e. in which the flow of evolution is assumed to be away from a designated root, towards the taxa) the problem is polynomial-time solvable, using the algorithm of Aho [1]. However, in the case of unrooted trees the problem is NP-hard, even when all the partial trees have at most 4 taxa [15]. Nevertheless, due to the fact that many tree-building algorithms actually construct *unrooted* trees, and because of the risk of distorting the underlying phylogenetic signal through a poor choice of root location, it remains attractive to try and solve this NP-hard variant of the problem directly.

In this article we approach the unrooted compatibility problem from a graph-theoretical angle. There is a recent trend in this direction, which to a large extent can be traced back to a seminal paper of Bryant and Lagergren [6]. They observed that there is a relationship between the compatibility question and the *treewidth* of an auxiliary graph known as the *display graph*. The display graph is obtained by identifying the taxa of the input trees, and treewidth is an intensely well-studied parameter in the algorithmic graph theory literature (for a survey see e.g. [5]). Low (or bounded) treewidth often facilitates algorithmic tractability. A linear time algorithm for computing treewidth is due to Bodlaender [4]. Though the theoretic runtime of the Bodlaender’s algorithm is linear, the algorithm is impractical because of the huge constant hidden in the big- O . For small treewidth, e.g. $q = 2, 3$, there is a practical algorithm by Arnborg, Corneil and Proskurowski [2] running in time $O(n^{q+2})$, where n is the number of vertices in the input graph.

Given that the treewidth is a measure of “distance from being a tree”, it is tempting to try and exploit this tractability in questions pertaining to phylogenetic compatibility and incongruence. Bryant and Lagergren observed that for k unrooted trees to be compatible, it is necessary (but not sufficient) that

the display graph has treewidth at most k . The upper bound on the treewidth that this condition generates, subsequently makes it possible to formulate and answer the compatibility question in a computationally efficient way. However, this efficiency is purely theoretical in nature, obtained via the indirect route of monadic second order logic [7], and it remains a challenge to succinctly characterize phylogenetic compatibility. Since Bryant and Lagergren various other authors have picked up this thread (e.g. [11]), with particular attention for triangulation-based approaches (see e.g. [16, 12, 17]) although the question remains: what *exactly* is the role of treewidth in compatibility?

Here we take a step forward in understanding the link between treewidth and compatibility. We prove that if the display graph of a set of unrooted binary trees has treewidth at most 2, then the input trees are compatible, and this holds for any number of input trees. In other words, it is not necessary to look deeper into the structure of the display graph, compatibility is immediately guaranteed. The proof of this, based on graph separators and graph minors, is surprisingly involved. Moreover, we describe a simple polynomial-time algorithm to construct a supertree for the input trees, when this condition holds. We also show that in some sense this result is “best possible”: we show how to construct both compatible and incompatible instances that have display graphs of treewidth 3, for any number of trees. This confirms that the treewidth of the display graph cannot, on its own, fully capture phylogenetic compatibility, and that auxiliary information is indeed necessary if we are to obtain a complete characterization.

2 Preliminaries

Let X be a finite set. An *unrooted phylogenetic X -tree* is a tree whose leaves are bijectively labeled by the elements of set X . It is called *binary* when all its inner nodes (nonleaf nodes) are of degree 3. An unrooted binary phylogenetic tree on four leaves is called a *quartet*. In the remainder of the article we focus almost exclusively on unrooted binary trees, often writing simply trees or X -trees for short.

We call elements of X *taxa* or *leaves*. For some X -tree T and some subset $X' \subseteq X$ we denote by $T(X')$ the subtree of T induced by X' and by $T|X'$ the tree obtained from $T(X')$ by suppressing vertices of degree 2. Furthermore, we say a tree S *displays* a tree T if T can be obtained from a subgraph of S by suppressing vertices of degree two.

Given a set X a *split* is defined as a bipartition of X . If we label the components of the partition by A and B , then we can denote the split by $A|B$. Note that each edge of an X -tree naturally induces a split. If $A|B$ is a split induced by an edge of a tree T , then we say that T *contains* split $A|B$. We use $ab|cd$ to denote the quartet in which taxa a and b are on one side of the internal edge and c and d are on the other. We write $ab|cd \in T$ if T displays $ab|cd$.

Given a set \mathcal{T} of k trees T_1, \dots, T_k we wish to know if there exists a single tree S that displays T_i for all $i \in \{1, \dots, k\}$. A tree that displays all the input trees,

if such a tree exists, is called a *supertree*. When a supertree does exist we call the instance *compatible*, otherwise *incompatible*. A supertree is not necessarily unique. To see when such a tree is unique and many more details on this topic we refer the reader to [9] or [14].

The *display graph* $D(\mathcal{T})$ of a set of trees \mathcal{T} is the graph obtained from the disjoint union of trees in \mathcal{T} by identifying vertices with the same taxon labels. Note that $D(\mathcal{T})$ can be disconnected if and only if the trees in \mathcal{T} can be bipartitioned into two sets $\mathcal{T}_1, \mathcal{T}_2$ such that $X(\mathcal{T}_1) \cap X(\mathcal{T}_2) = \emptyset$, where $X(T)$ refers to the set of taxa of T . In such a case \mathcal{T} permits a supertree if and only if both \mathcal{T}_1 and \mathcal{T}_2 do. Hence for the remainder of the article we focus on the case when $D(\mathcal{T})$ is connected.

Before we can start discussing our result we need a few graph theoretic definitions. Let $G = (V, E)$ be an undirected graph. For any two subsets of vertices $A, B \subseteq V$ and any $Z \subseteq V$ we say Z *separates* sets A and B in G if every path in G that starts at some vertex $u \in A$ and ends at some vertex $v \in B$ contains a vertex from Z . Such a set Z is called an (A, B) -*separator*, or simply a *separator*. A graph M is a *minor* of a graph G if M can be obtained from a subgraph of G by contracting edges.

The treewidth of a graph G , denoted $tw(G)$, has a somewhat technical definition. We give it here for completeness although for the main result it is sufficient to note that trees have treewidth 1, and that graphs with treewidth at most 2 are exactly those graphs that do not have a K_4 -minor (where K_4 is the complete graph on 4 vertices) [8]. We will also use the well-known fact that if M is a minor of G , $tw(M) \leq tw(G)$ [8].

Let G be a graph, T a tree and $(B_t)_{t \in T}$ a family of subsets of $V(G)$, also called *bags*, indexed by vertices of T . We say T is a *tree-decomposition* of G if the following conditions are satisfied:

- (T₁) $V(G) = \cup_{t \in T} B_t$;
- (T₂) for every edge $e \in G$ there exists a bag B_t in T such that both endpoints of e lie in B_t ;
- (T₃) $B_u \cap B_v \subseteq B_w$ whenever vertices u, v, w of T are such that w is on a path from u to v in T .

The width of a tree-decomposition is the size of its largest bag minus one. The *treewidth* of a graph G , also denoted $tw(G)$, is the minimum width over all possible tree-decompositions of G . For remaining graph theory terminology we refer to standard texts such as [8].

3 Main Results

We begin with some simple lemmas.

Lemma 1 [10, *Corollary 1*]. *Let T_1 and T_2 be two unrooted phylogenetic trees on the same set of taxa X . Then T_1 and T_2 are compatible if and only if there do not exist four taxa $a, b, c, d \subseteq X$ such that $ab|cd \in T_1$ and $ac|bd \in T_2$.*

Lemma 2 *Let D be the display graph of the two quartets $ab|cd$ and $ac|bd$. Then D has K_4 as a minor. Hence, $tw(D) \geq 3$.*

Proof: Both Q_1 and Q_2 have two inner nodes each. It is immediate to see that those four inner nodes form a K_4 minor in D . \square

Theorem 1 *Let T_1 and T_2 be two unrooted phylogenetic trees. Let D be the display graph of T_1 and T_2 . Then T_1 and T_2 are compatible if and only if $tw(D) \leq 2$.*

Proof: Let T_1 and T_2 be two trees on taxa sets X and X' respectively. Let $X^* = X \cap X'$. Then T_1 and T_2 are compatible if and only if $T_1|X^*$ and $T_2|X^*$ are compatible [14]. Thus we only have to consider two trees T_1 and T_2 on the same set of taxa X . Let $D(T_1, T_2)$ be their display graph. Suppose for the sake of contradiction that $tw(D(T_1, T_2)) \leq 2$ while T_1 and T_2 are incompatible. From Lemma 1, T_1 and T_2 contain incompatible quartets Q_1 and Q_2 (w.l.o.g. let T_i display Q_i) and since Q_i is displayed in T_i , $D(Q_1, Q_2)$ is a minor of $D(T_1, T_2)$. Since $D(Q_1, Q_2)$ is a minor of G , and using Lemma 2, $tw(G) \geq tw(D(Q_1, Q_2)) \geq 3$, contradicting the fact that $tw(D(T_1, T_2)) \leq 2$. This completes our proof in one direction; for the other see [6]. \square

In the following main theorem we emphasize that the trees in \mathcal{T} do not need to be on the same set of taxa, but that for this proof the input trees do need to be binary.

Theorem 2 *Let \mathcal{T} be a set of k binary unrooted phylogenetic trees T_1, \dots, T_k and let D be their display graph. If $tw(D) \leq 2$, then T_1, \dots, T_k are compatible, in which case a supertree can be constructed in polynomial time.*

Proof: We give a constructive proof in which we will build a supertree S for \mathcal{T} . The idea is to find an appropriate separator of D and to reduce the problem into smaller instances of the same problem i.e. an induction proof. The induction will be on the cardinality of $X = \cup_{T_i \in \mathcal{T}} X(T_i)$. For the base case observe that an instance with $|X| \leq 3$ is trivially compatible.

Before we start the construction we apply a number of operations on D that are safe to do, in the sense that they preserve (in)compatibility of the instance and do not cause the treewidth of D to rise. We remove any taxon that has degree 1 in D and contract any inner vertex that has degree 2 in D . This clearly affects neither the compatibility nor the treewidth. Furthermore, for every tree T_i with $i \in \{1, \dots, k\}$ that has fewer than 4 leaves, we exclude it from the display graph. Such a tree carries no topological information and thus does not change the compatibility, while removing something from a graph cannot increase its treewidth. The *cleaning up* procedure means that we apply all these operations on D repeatedly until we cannot apply them anymore (see figure 1). In other words, we can assume D to have treewidth exactly 2, that all inner vertices of D have degree 3, that all taxa have degree at least 2 and that no tree has fewer than 4 taxa.

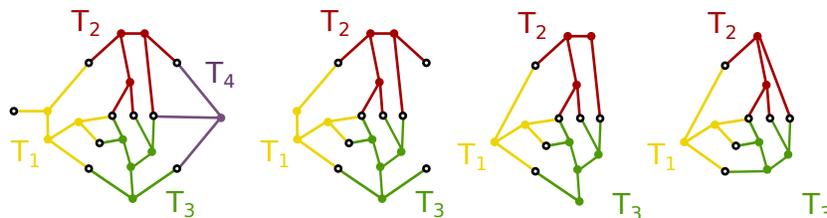


Figure 1: An example of cleaning up procedure. We start with a display graph of four trees and in the first step we remove the whole tree T_4 since it only has 3 leaves and we remove degree 1 taxon of T_1 . In the second step we compress the resulting degree 2 inner vertex of T_1 and remove degree 1 taxa of T_2 and T_3 . In the last step we compress the resulting degree 2 inner vertices of T_2 and T_3 . We cannot apply any of the operations anymore.

Consider a planar embedding of the display graph $D(\mathcal{T})$. This exists and can be found in polynomial time because $D(\mathcal{T})$ has treewidth at most 2. The *boundary* of a face F of $D(\mathcal{T})$, denoted $B(F)$, is the set of edges and vertices that are incident to the interior of the face. We say that two distinct faces F_1, F_2 are *minimally adjacent* if the following three conditions hold: (1) F_1 and F_2 are adjacent; (2) $B(F_1) \cap B(F_2)$ is isomorphic to a path containing at least one edge; (3) the internal vertices of the path $B(F_1) \cap B(F_2)$ all have degree 2 in $D(\mathcal{T})$, and the two endpoints of the path each have degree 3 or higher in $D(\mathcal{T})$.

We now show that if the treewidth of D is 2 we can always find two such faces, neither equal to the outer face, in polynomial time.

Observation 1 *Let \mathcal{T} be a non-empty set of unrooted binary trees on X such that $tw(D(\mathcal{T})) = 2$ and assume $D(\mathcal{T})$ is cleaned up. Consider any planar embedding of $D(\mathcal{T})$. Then there exist two distinct faces F_1, F_2 in $D(\mathcal{T})$ such that F_1 and F_2 are adjacent and neither is equal to the outer face.*

Proof: Without loss of generality we prove this for the case when $D(\mathcal{T})$ is connected. Recall that all vertices in $D(\mathcal{T})$ have degree at least 2, and at least one vertex has at least degree 3 (due to the existence of internal nodes). Hence, by the handshaking lemma, the number of edges in $D(\mathcal{T})$ is strictly larger than the number of vertices, and thus we can use Euler's formula to conclude that $D(\mathcal{T})$ has at least 3 faces. One of these is the outer face, so $D(\mathcal{T})$ has at least two faces not equal to the outer face. Hence, $D(\mathcal{T})$ contains at least two simple cycles. If any two simple cycles have a common edge, then we are done, so let us assume that all simple cycles in $D(\mathcal{T})$ are edge disjoint (and chordless). However, this is not possible due to the fact that in every simple cycle of a display graph at least two vertices have degree 3 or higher and the fact that all vertices in the graph have degree at least 2. (In particular, a simple cycle can never act as a "sink" to absorb excess degree, and there are also no leaves to fulfill this function.) \square

Observation 2 *Let \mathcal{T} be a non-empty set of unrooted binary trees on X . Assume $D(\mathcal{T})$ is cleaned up and $tw(D(\mathcal{T})) = 2$. Consider any planar embedding of $D(\mathcal{T})$. Let e be a cut-edge of $D(\mathcal{T})$, and let D_1, D_2 be the two components obtained by deleting e . Then both D_1 and D_2 have their own pair of adjacent faces, neither equal to the outer face.*

Proof: This is a simple adaptation of the previous proof. Deleting e reduces the degree of two vertices by exactly one, and all other degrees are unchanged. So D_1 and D_2 both contain at most one vertex of degree 1. From the previous “sink” observation we see that both D_1 and D_2 must contain two simple cycles with intersecting edges, and we are done. \square

Lemma 3 *Let \mathcal{T} be a non-empty set of unrooted binary trees on X . Assume $D(\mathcal{T})$ is cleaned up and $tw(D(\mathcal{T})) = 2$. Consider any planar embedding of $D(\mathcal{T})$. Then there exist two distinct faces F_1, F_2 in $D(\mathcal{T})$ such that F_1 and F_2 are minimally adjacent and neither is equal to the outer face. Also, these can be found in polynomial time.*

Proof: Fix any planar embedding of $D(\mathcal{T})$. Let G be the dual graph of $D(\mathcal{T})$ (i.e. a graph whose vertices are the faces of $D(\mathcal{T})$, including the outer face, and whose edges are the adjacency relation on those faces). We label each face F of G with the length of a shortest path in G from F to the outer face. Clearly, the outer face has label 0. Let k be the maximum label ranging over all faces. We select a pair of distinct faces (F_1, F_2) such that (1) F_1 has label k ; (2) F_2 is adjacent to F_1 ; (3) F_2 has the largest label ranging over all faces that are adjacent to a face with label k . By Observation 1, F_1 and F_2 both have label at least 1. Note also that the label of F_2 is either $k - 1$ or k . Clearly, F_1 and F_2 both satisfy property (1) of minimal adjacency.

Consider now the sequence of vertices and edges $v_1, e_1, v_2, e_2, \dots, v_n = v_1$ that define the boundary of face F_1 . Observe that with the exception of $v_1 = v_n$ all vertices on the boundary are distinct. This is because, if the boundary of the face intersects with itself, it creates a new face F_3 “inside” F_1 whose shortest path to the outer face is strictly larger than k , contradicting the minimality of k . Hence, $B(F_1)$ is a simple cycle. From this it follows that $B(F_1) \cap B(F_2)$ is a subgraph of a simple cycle. In particular, it can be (a) a simple cycle or (b) a set of one or more paths (where some of the paths might have length 0). We show that (a) cannot happen. To see this, observe that (a) can only happen if $B(F_1) \subseteq B(F_2)$. From the degree constraints mentioned earlier the simple cycle defining F_1 contains at least 2 vertices of degree 3 or higher, in $D(\mathcal{T})$. These two vertices u_1, u_2 generate paths that cannot enter the interior of F_1 , because they would then necessarily slice F_1 up into smaller faces. Moreover, there cannot exist a path from u_1 to u_2 that avoids $B(F_1)$, because this would imply the existence of a third face F_3 adjacent to F_1 , such that $B(F_1) \cap B(F_3)$ contains an edge not in $B(F_2)$. In particular, this would contradict $B(F_1) \subseteq B(F_2)$. For a similar reason, the generated paths cannot re-intersect with $B(F_1)$. Careful analysis shows that the only remaining possibility is that F_2 is the outer face,

contradicting the fact that the label of F_2 is at least 1. Hence we conclude that (a) is not possible, and that (b) must hold.

We now establish property (2) of minimal adjacency. In particular we show that $B(F_1) \cap B(F_2)$ has a single component. By the definition of adjacency, and the fact that (b) holds, at least one component in $B(F_1) \cap B(F_2)$ is a path P on one or more edges. Clearly, the two endpoints of P must (in $D(\mathcal{T})$) have degree 3 or higher, otherwise P could be extended further. Without loss of generality consider the lower endpoint u . Let e be an edge incident to u (in $D(\mathcal{T})$) that is not in $B(F_1) \cap B(F_2)$ but which is incident to F_1 (such an edge must exist). The second face incident to e cannot be F_2 , because otherwise e would be in P , so it must be some other face $F_3 \neq F_2$. Suppose there exists a path $P' \neq P$ in $B(F_1) \cap B(F_2)$. (Possibly, P' is a single vertex). In this case it is possible to draw a closed curve that passes through P and P' and such that the only face interiors that it intersects with, are those of F_1 and F_2 (see Figure 2). Informally this means that face F_3 is entirely “enclosed” by F_1 and F_2 .

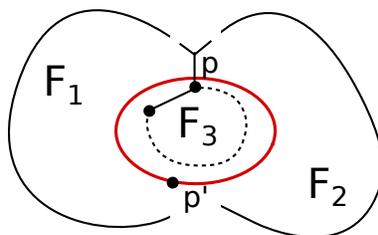


Figure 2: If $B(F_1) \cap B(F_2)$ consists of two or more components P, P' then it is possible to draw a curve (shown in red) completely enclosing a third face F_3 , yielding a contradiction on the choice of F_1 and/or F_2 .

More precisely, it means that any (shortest) path in G from F_3 to the outer face must pass through F_1 or F_2 . If such a shortest path travels via F_1 , then the label of F_3 is at least $k + 1$, contradicting the maximality of k . If it travels via F_2 , then it has label k or $k + 1$. The latter is clearly a contradiction, but also the former because this contradicts our earlier choice of F_2 (i.e. we should have chosen F_3 instead of F_2). Hence, $B(F_1) \cap B(F_2)$ indeed consists of a single path P (containing at least one edge).

It remains to prove property (3). We have already established that the endpoints of P have degree 3 or more in $D(\mathcal{T})$. If P has no interior vertices, or all interior vertices of P have degree 2 in $D(\mathcal{T})$, we are done. So suppose P contains an interior vertex u of degree 3 or more in $D(\mathcal{T})$. Let e be an edge incident to u (in $D(\mathcal{T})$) that is not in $B(F_1) \cap B(F_2)$. Clearly, e starts a path that extends into the interior of F_1 or F_2 . If e is not a cut-edge then the path it starts must re-intersect with the boundary of F_1 or F_2 , but this causes a face to be partitioned into smaller pieces, which is not possible. Hence, e must be a cut-edge. From Observation 2 deleting e yields two or more adjacent faces that

are entirely “enclosed” by F_1 or F_2 . If they are enclosed by F_1 then they both have label $k + 1$, which is a contradiction. If they are enclosed by F_2 , and F_2 has label k , the same contradiction is obtained. If they are enclosed by F_2 , and F_2 has label $k - 1$, then they both have label k , contradicting the fact that we chose F_2 in the first place.

Polynomial time is assured since recognition of treewidth 2, planar embeddings and determination of the labels can all be computed in linear time. \square

So let F_1 and F_2 be two minimally adjacent faces of D , neither equal to the outer face. Denote by $p(u, v)$ the path $B(F_1) \cap B(F_2)$ they share. (After locating F_1 and F_2 this path can easily be found in polynomial time). By definition u and v must have degree at least 3 in D . Also, by minimal adjacency of F_1 and F_2 and due to cleaning up, none of the interior nodes of $p(u, v)$ can be internal tree nodes. Moreover, since we removed all trees on fewer than four taxa, at most one leaf can appear as an interior node of the path. Such a leaf can only exist if both u and v are inner nodes of some trees. Now, u and v can either be both leaves, both inner nodes or one of them a leaf another an inner node. These are the three cases we have to consider.

Case(i) is when both u and v are leaves. We claim this cannot happen. In this case, path $p(u, v)$ must be an edge. But if it is an edge it is connecting two leaves and will have already been removed during cleaning up.

Case(ii) is when u is a leaf and v is an inner node. Again we have that path $p(u, v)$ must be an edge (u, v) which both faces share. Let x , respectively y , be any vertex other than u or v on the boundary of F_1 , respectively F_2 . See Figure 3(a). We claim that any path between x and y must contain either u or v . In particular, suppose there exists a path $p(x, y)$ such that $u, v \notin p(x, y)$. Let x' and y' be vertices on $p(x, y)$ such that the subpath $p(x', y')$ is the shortest subpath of $p(x, y)$ with the property that both of its endpoints are on the boundaries of F_1 and F_2 , respectively. See Figure 3(a). Then D contains a K_4 minor formed by vertices u, v, x' and y' . This is a contradiction on D having treewidth 2. So we have that any path between x and y passes through either u or v . Thus $\{u, v\}$ is a separator of D .

Removing u and v from the vertex set of D disconnects it and divides the set of taxa into two sets X_1 and X_2 , such that $X = X_1 \cup X_2 \cup \{u\}$. We claim that supertree S as shown in Figure 3(b), where S' is a supertree of T_1, \dots, T_k restricted to taxa set $X \setminus \{u\}$, displays all k input trees T_1, \dots, T_k . To prove this we have to show two things. One, that the supertree S' exists (and that it has an edge corresponding to split $X_1|X_2$) and two, that all quartets in T_1, \dots, T_k are also in S . The latter is sufficient because of a well known result in phylogenetics that a set of unrooted trees is compatible if and only if the set of quartets

⁰We chose this less formal and more intuitive proof of Lemma 3 in order to keep the notation and presentation simple. An alternative approach was to use the Jordan Curve Theorem, see for e.g. [13].

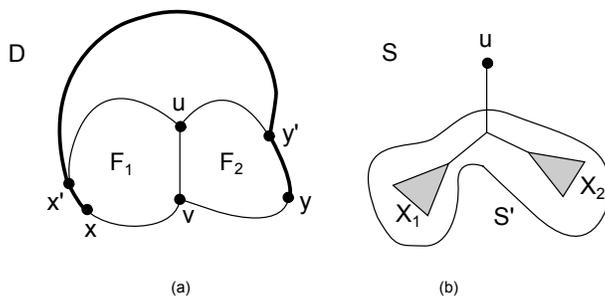


Figure 3: (a) Two minimally adjacent faces F_1 and F_2 in D . The vertices u, v, x', y' induce a K_4 minor. (b) A supertree as constructed in case (ii).

displayed by the trees is compatible [14].

To prove the first claim let $X' := X \setminus \{u\}$ and notice that by induction the instance $T_1, \dots, T_k|X'$ is compatible and thus has a supertree. We now claim that there exists some supertree of $T_1, \dots, T_k|X'$, call it S' , which contains split $X_1|X_2$. First of all notice that (a restriction of) $X_1|X_2$ must be a split in every input tree restricted to X' . To see this we show that there does not exist a quartet $ab|cd$ with $a, c \in X_1$ and $b, d \in X_2$ in any of the input trees (prior to removal of u and v). Suppose such a quartet did exist in some tree. Then there would exist edge-disjoint paths $p(a, b)$ and $p(c, d)$ in D , where the interior nodes of these paths are internal tree nodes. Since removing u and v from D disconnects it (such that X_1 and X_2 are subsequently in separate components), it must be that those paths had to use either u or v . Since u is a taxon it cannot be used for this purpose. So both paths had to use inner vertex v . However, this contradicts the edge-disjointness of the two paths. Hence quartet $ab|cd$ cannot be displayed by any tree.

We conclude from this that in each $T_i|X'$ there exists an edge e that induces a split $A|B$, such that $A \subseteq X_1$ and $B \subseteq X_2$. Furthermore both X_1 and X_2 must contain at least one taxon each. (This follows because edge (u, v) belongs to some input tree T , and walking from u to v along the boundary of F_1 whilst avoiding edge (u, v) necessitates entering and leaving T via its taxa, which in turn means that some taxon not equal to u must exist on the part of the boundary of F_1 not shared by F_2 .) The same argument holds for F_2 .) As such, in each $T_i|X'$ it is possible to contract (the subtree induced by) X_1 and/or X_2 into a single “meta-taxon”.

Let T^* (respectively, T^{**}) be the set of trees obtained by taking the trees on X' and contracting all the X_2 (respectively, X_1) taxa into a single meta-taxon W_2 (respectively, W_1). Note that contracting in this way cannot increase the treewidth of D and that $1 \leq |X_i| < |X|$ for $i \in \{1, 2\}$. Hence, by induction supertrees of T^* and T^{**} exist. Finally, construct supertree S' with split $X_1|X_2$ from two supertrees for T^* and T^{**} by adding an edge between W_1 and W_2 and afterwards suppressing W_1 and W_2 . (The function of W_1 and W_2 was pre-

cisely to ensure that we would know how to glue the two separately constructed supertrees together).

To see the second claim note that since S' is a supertree of T_1, \dots, T_k restricted to $X \setminus \{u\}$ we only have to show that quartets of T_1, \dots, T_k that contain taxon u are displayed by S . So w.l.o.g. let $a \in X_1, b, c \in X_2$. Then if quartet $au|bc$ is displayed by some input tree T it is also clearly displayed by the supertree S . We claim quartets $ub|ac$ or $uc|ab$ cannot exist in any of the input trees. These two quartets are the same up to relabeling so let's consider quartet $ub|ac$ induced by some tree T sitting inside D . Then $p(u, b)$ and $p(a, c)$ are edge-disjoint and contain no taxa. As argued before $p(a, c)$ must pass through v . But since (u, v) is an edge it follows that it must belong to the same tree T , and therefore v also lies on the path $p(u, b)$. But then it is not possible that T displays $ub|ac$, contradiction.

Case(iii) is when both u and v are inner nodes. We could have that $p(u, v)$ is an edge, in which case u and v are inner nodes of the same tree, or we could have that $p(u, v)$ contains a single taxon t . Note that in the latter case u and v are inner nodes of two different trees and taxon t must have degree 2 in D due to the minimal adjacency of F_1 and F_2 . The argument for $\{u, v\}$ being a separator of D goes through in this case as well regardless of $p(u, v)$ being an edge or a path containing a single taxon t . We again denote by X_1 and X_2 the two sets of taxa that emerge from splitting D by removing u and v (and t if it exists on (u, v)).

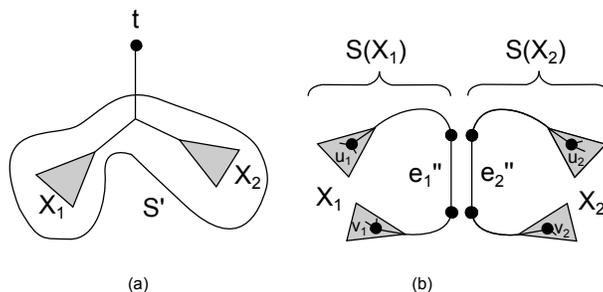


Figure 4: (a) A supertree constructed in case (iii) when there exists a taxon t on the common boundary of the two faces. (b) Construction of a supertree in case (iii) when the common boundary of the two faces is a single edge.

Subcase 1. Consider first the subcase when some taxon $t \in p(u, v)$. As before we have to show that there exists some S' , a supertree of T_1, \dots, T_k restricted to $X' := X \setminus \{t\}$ with split $X_1|X_2$, and that the supertree S as shown in Figure 4(a) displays all quartets induced by T_1, \dots, T_k . The proof for this case is almost identical to that of case (ii). There we used the fact that u was a leaf. We now show that all the statements made in case (ii) also hold when u is an inner node and t is a taxon on path $p(u, v)$.

We saw that in case (ii) both X_1 and X_2 were nonempty and of strictly smaller cardinality than X . In this subcase, the fact that the cardinalities of X_1 and X_2 are strictly smaller than of X follows from $t \in X$ but $t \notin X_1$ and $t \notin X_2$. The fact that the sets are nonempty also holds. Consider face F_1 . Let u be a node of some tree T_1 and v a node of some other tree T_2 . Then the path from u to v that follows the part of the boundary F_1 not shared by F_2 , is a path between two vertices of different trees and so must contain some taxon $a \neq t$ (which is also in X_1). The same argument holds for F_2 and X_2 . Another thing we have to show here is that all input trees T_1, \dots, T_k restricted to X' respect split $X_1|X_2$ (i.e. each tree contains an edge e inducing a split $A|B$ where $A \subseteq X_1$ and $B \subseteq X_2$). Suppose there exists a quartet $ab|cd$ with $a, c \in X_1$ and $b, d \in X_2$ in some input tree T . Since removing u and v from D disconnects it, it must be that two paths $p(a, b)$ and $p(c, d)$ had to pass through either u or v . W.l.o.g. let $u \in p(a, c)$ and $v \in p(b, d)$. Furthermore paths $p(a, b)$ and $p(c, d)$ are edge-disjoint in D and belong to the same tree T . But this is impossible since u and v belong to different trees in this case. Contradiction. So we conclude in this case too that every input tree restricted to X' respects split $X_1|X_2$, and hence the contraction of X_1 and X_2 into meta-taxa works exactly as described in case (ii). Hence, S' indeed exists, can be constructed and has split $X_1|X_2$.

Next, we claim that S as shown in Figure 4(a) displays all quartets induced by T_1, \dots, T_k . As before, since S' is a supertree of $T_1, \dots, T_k|X'$ we only need to check the quartets induced by T_1, \dots, T_k that contain taxon t . W.l.o.g. let $a \in X_1$ and $b, c \in X_2$. There are three possible topologies $at|bc, bt|ac, ct|ab$. As before, $at|bc$ is an easy case since if it appears in some T in D it clearly also appears in S , while topologies $bt|ac$ and $ct|ab$ are the same up to relabeling. So consider $bt|ac$ and suppose it is displayed by some tree T . Paths $p(b, t)$ and $p(a, c)$ are edge-disjoint and since the degree of t is 2 in D we have that $p(b, t)$ has to contain either u or v . W.l.o.g. let $u \in p(b, t)$. Now, since $\{u, v\}$ is a separator of D and $a \in X_1$ while $c \in X_2$, we have that either $u \in p(a, c)$ or $v \in p(a, c)$. If $u \in p(a, c)$ we have that paths $p(b, t)$ and $p(a, c)$ both contain node u , a contradiction on $bt|ac$ being displayed by T . If $v \in p(a, c)$ then edge (v, t) and (u, t) must both belong to the same tree T , which contradicts our earlier observation that u and v are necessarily in different trees.

Subcase 2. The last thing to consider is the subcase when (u, v) is an edge while both u and v are inner nodes (necessarily of the same tree T). Let X_1 and X_2 be two disjoint sets of taxa that result from splitting D after removing u and v . We claim that $|X_1| \geq 2$ and $|X_2| \geq 2$. This follows directly from $u, v \in T$: any cycle that links them together must leave the tree T via some taxon a and re-enter it via a (necessarily different) taxon b . Since u and v belong to both faces F_1 and F_2 it follows that the boundaries of these two faces must each contain (at least) two taxa. The two taxa on the boundary of (w.l.o.g.) F_1 are still in the same connected component after deletion of $\{u, v\}$, but are not in the same connected component as the taxa from the boundary of F_2 , so $|X_1| \geq 2$ and $|X_2| \geq 2$.

Now we claim that the tree shown in Figure 4(b) is a supertree of T_1, \dots, T_k . Let's first explain what that image means. Note that apart from the tree T in which the internal edge $e = (u, v)$ can be found, all other trees have taxa sets either completely contained inside X_1 or completely contained inside X_2 . This is the case because otherwise there would be a path from some element in X_1 to some element in X_2 , contradicting the fact that $\{u, v\}$ is a separator. The idea is to cut T into two parts, one on X_1 , one on X_2 , recursively build supertrees of $T_1, \dots, T_k|X_1$ and $T_1, \dots, T_k|X_2$ and join them as indicated in the figure.

Now, consider the display graph D . Suppose we delete the edge $e = (u, v) \in T$, and replace it with two edges $e_1 = (u_1, v_1)$ and $e_2 = (u_2, v_2)$ (where u_i and v_i are u and v duplicated). Because $\{u, v\}$ is a separator, this creates two disjoint display graphs, one on X_1 and one on X_2 . These are minors of the original display graph so have treewidth at most 2, and they are smaller instances of the problem. So by induction supertrees of these smaller instances exist. Let $S(X_1)$ be a supertree on X_1 and $S(X_2)$ be a supertree on X_2 . All trees except T will be displayed by the disjoint union of $S(X_1)$ and $S(X_2)$, because only T has taxa from both X_1 and X_2 . What is left to explain is how to glue $S(X_1)$ and $S(X_2)$ into a supertree S such that S displays T as well.

Note that $S(X_i)$ contains an image of edge e_i . The image need not be an edge in $S(X_i)$, it could also be a path, whose endpoint we denote by u_i and v_i in Figure 4(b). Take any edge on path $p(u_i, v_i)$, call it e'_i , and subdivide it twice to create two adjacent degree-2 vertices; let e''_i be the edge between them. Now, by identifying e''_1 and e''_2 we ensure that we get a supertree that displays (all the quartets in) T , as well as all the other trees.

This completes the case analysis. Polynomial time is achieved because all relevant operations (recognizing whether a graph has treewidth at most 2, finding a planar embedding, finding two minimally adjacent faces, finding the separator $\{u, v\}$, and all the various tree manipulation operations) can easily be performed in linear time. \square

We now give a summary of the algorithm that has already been implicitly described in the above proof. As input we are given k phylogenetic trees on $|X|$ taxa. We construct the display graph D of the k trees and clean it up. The size of the display graph is at most $|X| + k(|X| - 1)$ vertices. We start by verifying (in time linear in number of vertices of D) that the treewidth of D is at most 2. Next we construct a planar embedding of D and find its dual G . This step also only takes linear time.

We label the faces of G (there are as many of them as vertices of D) by computing shortest paths from the outer face to each face of G . Since this is a single source shortest path problem, it too can be computed in time linear in $|V(D)|$. We select the largest label (and the face adjacent to the face with the largest label); these are our minimally adjacent faces F_1 and F_2 . If two such faces do not exist, then the instance is trivially compatible.

By definition of minimal adjacency we know that the intersection of borders of the two faces must be isomorphic to a path $p(u, v)$ containing at least one edge. Denote by X_1 and X_2 are two sets of taxa obtained from separating D

by removing $\{u, v\}$.

We saw that we can w.l.o.g. assume v to be an inner node. If u is a leaf, then we construct a supertree S as shown in figure 3(b) and recursively solve two smaller instances with input trees $T_i|X_1$ and $T_i|X_2$ for $i \in \{1, \dots, k\}$. (Note that in the actual algorithm we also add an extra “meta-taxon” into each of the two smaller instances which tells us where to graft the two solutions back together). Otherwise, u is an inner node. In this case, path $p(u, v)$ can either contain a taxon t or be an edge. When it contains a taxon t a supertree S is given in figure 4(a) and we recursively solve two smaller instances with input trees $T_i|X_1$ and $T_i|X_2$ for $i \in \{1, \dots, k\}$ (note that in this case the two taxa sets X_1 and X_2 are obtained after removing $\{u, v, t\}$ from D). When u is an inner node and $p(u, v)$ is an edge, then we construct a supertree as in figure 4(b) and recursively solve two smaller instances $T_i|X_1$ and $T_i|X_2$ for $i \in \{1, \dots, k\}$. We continue until the instance is trivially compatible.

Finally, we discuss the time complexity of the algorithm. One side of each recursively found split contains only one taxon in worst case, while the number of trees does not decrease. Therefore, in the worst case the number of iterations is $|X|$, and as we just argued each iteration takes time that is linear in $|X|$ and k . Thus, the runtime of our algorithm is quadratic in the input size.

4 Beyond Treewidth 2

Two incompatible quartets induce a display graph with treewidth 3, so treewidth 3 cannot guarantee compatibility. However, it is natural to ask whether treewidth 3 guarantees compatibility if the number of input trees becomes sufficiently large. Unfortunately, the answer to that question is no. Namely, for any number of trees there exists a compatible instance with $tw(D) = 3$ and an incompatible instance with $tw(D) = 3$, as we now demonstrate.

Consider figures 5 and 6. They both show the display graph of k trees with leaves indicated by black circles and inner nodes of each tree indicated by filled circles in the same color as that of the tree they correspond to. Both graphs contain K_4 as a minor. Thus, the treewidth of the graphs is at least 3. As it can be easily verified either by any available software or by giving a tree decomposition of width 3, the key structural bags of which are depicted in Figure 7, the treewidth of both of these display graphs is exactly 3.

The display graph in figure 5 however shows an instance that is compatible. This can be verified without too much difficulty. We already argued that the cleaning up procedure preserves (in)compatibility; we will use this now. Notice then that we can remove two leaves of T_k with degree 1, making T_k a tree on three leaves. We can thus remove the whole tree, thereby making T_{k-1} and T_{k-2} trees on three leaves. Removing T_{k-1} and T_{k-2} makes T_{k-3} a tree on three leaves etc. In the end we are only left with a single tree, T_1 . Since a single tree is trivially compatible it follows that all k trees are compatible.

Figure 6 on the other hand shows an incompatible instance. We can again

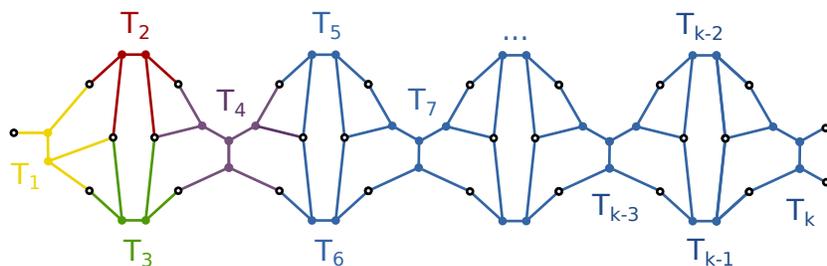


Figure 5: Display graph of an instance with k input trees. Leaves of all trees in this image are marked by black circles, while inner nodes are marked by filled circles in the same color as the tree they belong to. The treewidth of D is 3 and the instance is compatible.

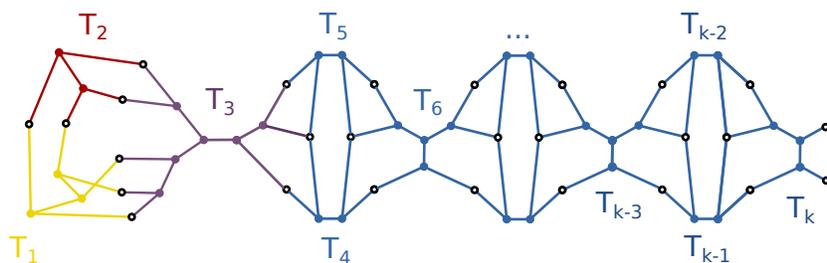


Figure 6: Display graph of an instance with k input trees. Leaves are marked by black circles, while inner nodes are marked by filled circles in the color of the corresponding tree. The treewidth of D is 3 and the instance is incompatible.

start cleaning up this instance from T_k backwards until we are left with T_1, T_2 and T_3 . Figure 8, first panel, shows the display graph of T_1, T_2 and T_3 . We can do one more cleaning up step and end up with a graph in the middle panel (we abuse the notation slightly and call the cleaned up version of T_3, T_3 again). We argue that the three trees in the middle panel of Figure 8 are incompatible.

In the third panel of Figure 8 we try to build a supertree of the three trees in order to reach a contradiction. We start with T_3 and add T_1 to it. T_3 already contains leaves 1,2,3 of T_1 so we only have to decide where to add leaves 6 and 7. Notice that T_1 requires paths $p(1, 6)$ and $p(2, 7)$ to be disjoint. Furthermore, an inner vertex k of T_1 is (by definition of a tree) the only vertex with a property that paths $p(1, k), p(2, k), p(3, k)$ are edge-disjoint. If we want to map it to T_3 there is only one place where it can be (as indicated in the third panel of the Figure 8). From the condition that paths $p(1, 6)$ and $p(2, 7)$ must be disjoint, it follows that leaf 6 has to be attached somewhere on the path $p(1, k)$ and leaf 7 has to be attached somewhere on the path $p(2, k)$. Since these two paths are in fact edges in T_3 it follows that there only one place where we can attach leaves 6 and 7 respectively. So the supertree of T_1 and T_3 is unique. Furthermore, it contains a quartet 45|67 which is incompatible with tree $T_2 = 47|56$. So the

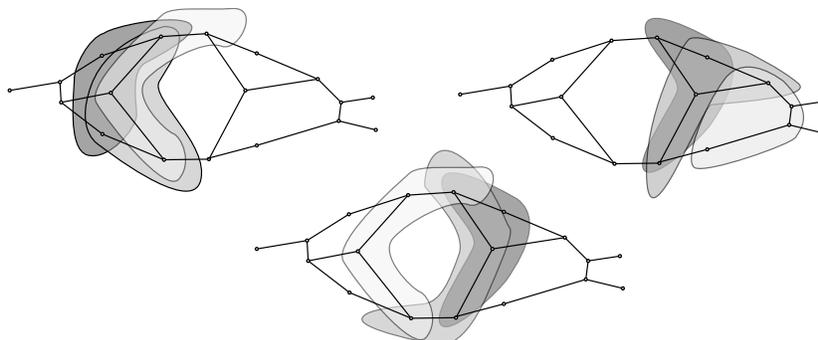


Figure 7: Tree decomposition of display graph of k compatible trees given in figure 5 such that each bag contains exactly four vertices. Due to the symmetry of the graph, we only give decomposition for the first part.

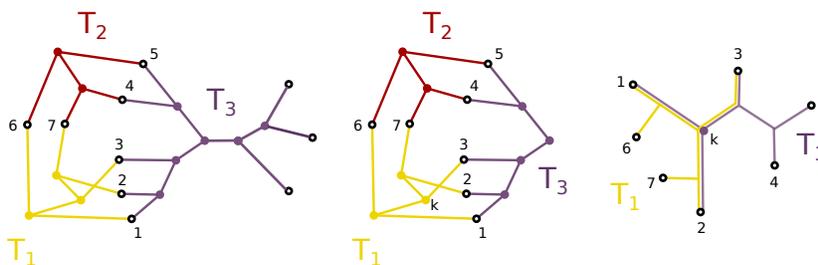


Figure 8: A display graph of three incompatible trees; A cleaned-up display graph of the same three trees; A unique supertree of T_1 and T_3

three trees T_1, T_2 and T_3 are incompatible, and thus all k trees from Figure 6 must be incompatible.

5 Conclusion

Figure 9 summarizes our results. The red area is due to result of Bryant and Lagergren which proves that that any instance on k trees whose display graph has treewidth strictly greater than k must be incompatible. The green area is due to our result. What we are left with is the gray area in which (as demonstrated by the constructions in the previous section) we cannot conclude anything about compatibility of the instances based only on treewidth of the display graph and the number of trees, at least not with the current results. An obvious open question is whether existing characterizations (such as legal triangulations [16]) can be specialized to yield simple and efficient combinatorial algorithms in the case of treewidth 3 or higher.

# trees \ tw(D)	2	3	4	5	6	7	8	...
2	Thm1							
3								
4								
5								
6	Thm2							
7								
8								
⋮								

Figure 9: The green (respectively, red) area shows which combinations of (number of input trees, treewidth of display graph) are always compatible (respectively, incompatible). The gray area indicates that both compatible and incompatible instances exist for this combination of parameters.

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