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Running head: DESIRABLE PROPERTIES FOR VETO SUPERTREES.

## ***PhySIC: a Veto Supertree Method with Desirable Properties***

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## Abstract

This paper focuses on veto supertree methods, ie methods that aim at producing a conservative synthesis of the relationships agreed upon by all source trees. We propose desirable properties that a supertree should satisfy in this framework, namely the *non-contradiction* property (PC) and the *induction* property (PI). The former requires that the supertree does not contain relationships that contradict one or a combination of the source topologies, while the latter requires that all topological information contained in the supertree is present in a source tree or collectively induced by several source trees. We provide simple examples to illustrate their relevance and that allow a comparison with previously advocated properties. We show that these properties can be checked in polynomial time for any given rooted supertree. Moreover, we introduce the *PhySIC* method (PHYlogenetic signal with Induction and non-Contradiction). For  $k$  input trees spanning a set of  $n$  taxa, this method produces a supertree that satisfies the above-mentioned properties in  $O(kn^3 + n^4)$  polynomial computing time. The polytomies of the produced supertree are also tagged by labels indicating areas of conflict as well as areas with insufficient overlap. As a whole, *PhySIC* enables the user to quickly summarize consensual information of a set of trees and localize groups of taxa for which the data requires consolidation. Lastly, we illustrate the behaviour of *PhySIC* on primate datasets of various sizes, and propose a supertree covering 95% of all primate extant genera. The *PhySIC* algorithm is available at <http://atgc.lirmm.fr/cgi-bin/PhySIC/physic.cgi>.

# Introduction

## Building supertrees

Phylogenies are invaluable tools in various areas of biology to understand the evolution of genes and taxa. Trees that incorporate an exhaustive sampling of taxonomic biodiversity provide crucial information about systematics, genomics, and diversification patterns of species (e.g. Davies et al., 2004). Large trees can be built using various approaches, including supermatrices and supertrees. The former approach consists of combining the different source datasets into a *supermatrix* of characters, and then analyzing it under standard phylogenetic reconstruction criteria (e.g. Delsuc et al., 2005). The supertree approach is an alternative methodology using trees rather than character data as a primary source of information. It first involves inferring smaller, partially overlapping, source phylogenetic trees from initial character data, and then assembling them into a larger, more comprehensive *supertree* (Bininda-Emonds, 2004a). This approach is particularly convenient when dealing with heterogeneous character sources, e.g. those scored from morphological, transposable elements, DNA, or protein studies. Supertrees have become increasingly popular (e.g. Bininda-Emonds, 2004b), notably since the seminal work involving the reconstruction of the primate supertree (Purvis, 1995a). The widespread use of supertrees is explained by three useful applications (Wilkinson et al., 2004): (i) they provide large phylogenetic frameworks for broad comparative studies; (ii) they evaluate the congruence of sets of input trees, and reveal conflicts due to outlier/unstable taxa; and (iii) they identify insufficient overlap among leaf sets of input trees, and assign priorities for choosing the taxa to be subsequently sampled.

## Different kinds of supertree methods

Supertree methods fall into three categories depending on their way of handling topological conflicts, i.e. different arrangements of the same leaves among labeled source trees.

The first suite of methods do not handle incompatible source trees. The pioneering methods that belong to this category are *Build* (Aho et al., 1981) and the strict consensus supertree (Gordon, 1986). Although they are important milestones, these methods appear “of limited use. As most systematics know, phylogenies usually conflict with one another” (Bininda-Emonds, 2004b, p4).

The second suite of methods handle conflicts among input trees in a liberal way: they apply a *voting* procedure. In order to extract their main phylogenetic signal, source trees are asked to vote on various parts of the phylogeny to be inferred, with the most supported candidates being elected and composing the output supertree. Voting methods are said to *resolve* conflicts (Thorley and Wilkinson, 2003): for each conflict, they use some optimization criterion to make a decision in favor of one of the topological alternatives. Most conflicts among input trees are expected to be resolved because relationships displayed by the supertree are guided by source topologies on the basis of weight of evidence. The most widespread voting method is Matrix Representation with Parsimony (MRP) whereby nodes of each source tree are encoded as binary characters of a matrix that is then analyzed with the maximum parsimony criterion to obtain the composite tree (Baum, 1992; Ragan, 1992). Analyzing this binary encoding of source topological information with other tree-building criteria leads to variants of MRP such as Matrix Representation with Flipping (MRF; Chen et al., 2003) and Matrix Representation with Compatibility (MRC; Ross and Rodrigo, 2004). Other methods of the voting kind such as MinCut (MC; Semple and Steel, 2000) and ModifiedMinCut (MMC; Page, 2002), encode source trees in a graph that is progressively decomposed to get supertree clades. When conflicts hinder the decomposition, the graph is cut by

removing the least supported relationships. A different way to apply the voting approach involves averaging the initial distance matrices, converted from source characters or valued topologies, into a *superdistance* matrix; a tree-building distance-based approach is then used to infer a supertree from the matrix (Lapointe and Cucumel, 1997; Criscuolo et al., 2006). Interestingly, voting methods like MRP may generate *novel* clades, i.e. clades not present in any input tree alone (Purvis, 1995b; Bininda-Emonds and Bryant, 1998; Sanderson et al., 1998). Unfortunately, when source trees conflict, clades that are contradicted by each of the source trees can be present in the supertree inferred by MRP (Goloboff and Pol, 2002; Goloboff, 2005; Cotton et al., 2006) and by MRF (Goloboff, 2005), and “this situation is, clearly, not very unlikely” (p.285 Goloboff, 2005).

The third suite of methods handle conflicts among input trees in a conservative way. They adopt a *veto* philosophy: the phylogenetic information of every source topology is to be respected, and the supertree is not allowed to contain any group that a source tree would vote against. These methods *remove* conflicts (Thorley and Wilkinson, 2003) because they either propose multifurcations in the supertree (Goloboff and Pol, 2002), or prune rogue taxa (Berry and Nicolas, 2004). In this framework, the supertree should not retain a single branching pattern within a given clade when several valid topological alternatives are actually present in the source trees. The full agreement required by veto methods provides an unambiguous phylogenetic framework that is, for instance, well suited for taxonomic revisions. More specifically, such a conservative approach may be applied to automatically build or update parts of the Tree of Life (<http://tolweb.org>). Several supertree methods akin to the veto philosophy have been proposed, all of which are inspired by consensus approaches that operate on trees with identical leaf sets. For example, extensions of the strict consensus (Gordon, 1986; Huson et al., 1999), semi-strict consensus (Goloboff and Pol, 2002), and maximum agreement subtree consensus (Berry and Nicolas, 2004) have been proposed to infer veto supertrees.

## Properties of supertree methods

To assess the relevance of supertree methods, it is most useful to have properties characterizing the extent to which the supertrees they infer are reliable syntheses of source trees (Bininda-Emonds and Bryant, 1998; Steel et al., 2000; Wilkinson et al., 2004; Goloboff, 2005). For instance, Steel et al. (2000) suggest that the output supertree should (i) encompass every source tree when possible, (ii) always contain every leaf (taxon) that occurs in at least one source tree, and (iii) be computed under a running time that grows polynomially with respect to the total number of leaves. These authors also showed that rooted input trees are more appealing than unrooted ones for supertree methods that aim to satisfy several desirable properties simultaneously. Yet, even if supertree methods satisfy some desirable properties, the inferred supertrees often contain polytomies which actually intermix two distinct phenomena: either a lack of overlap in the topological information among source trees, or the occurrence of topological conflicts among them, or a combination of these. We thus decided to develop a method that provides biologists with explanations about the causes of polytomies as well as unambiguous resolutions in supertrees. For this purpose, we rely on two new formal properties.

On the one hand, we think that supertree methods should avoid arbitrary resolutions, i.e. resolutions that are not entailed by the source topologies. Indeed, novel relationships displayed by a supertree “are worrying if they are not implied by combinations of the input trees” (Wilkinson et al., 2005), and “should be identified as such, to highlight their lack of any known justification” (Pisani and Wilkinson, 2002). Thus, we first request that every piece of phylogenetic information displayed in the supertree be present in one or several source topologies, or be induced by their interaction; we call this the *induction* property.

On the other hand, we focus on unanimous clades, thus adopting a veto point of view.

This means that the supertree is not allowed to contain a clade that conflicts either directly with a source tree or indirectly with a combination of them. We call this the *non-contradiction* property. Such a supertree, that incorporates only uncontradicted input relationships, provides a reliable baseline for subsequent analyses (Goloboff and Pol, 2002; Goloboff, 2005).

Goloboff and Pol (2002) mentioned similar properties in a formal characterization involving triplets. They provide examples showing that supertree methods of the voting kind, such as MRP and MC, understandably do not respect these properties. Although being appealing, the characterization proposed by Goloboff and Pol (2002) can at times be too restrictive or permissive (see following sections). Recently, Grunewald et al. (2006) provided another characterization of a property related to arbitrary resolutions contained in the supertree with respect to source trees. In both cases, there does not seem to be any straightforward algorithm that would always allow for property verification. Note, however, that Goloboff and Pol (2002) proposed a supertree heuristic algorithm that satisfies the desired properties in most cases.

In this paper, we provide a characterization of non-contradiction and induction properties, that differ from those of Goloboff and Pol (2002) and Grunewald et al. (2006). We also describe simple and polynomial-time algorithms that enable users to check whether or not a given supertree satisfies these properties. Then we propose an algorithm called *PhySIC* that improves the *Build* algorithm (Aho et al., 1981) by always inferring a supertree and which, moreover, satisfies the non-contradiction and induction properties. As far as we know, this is the first time that a polynomial-time method is proposed that always satisfies properties related to induction and non-contradiction. Moreover, improving the behavior of *Build* with respect to arbitrary decisions can benefit the various methods that extend this algorithm for supertree purposes, e.g. MC (Semple and Steel, 2000), MCC (Page, 2002), AncestralBuild (Daniel and Semple, 2004; Berry and Semple, 2006) and RankedTree (Bryant et al., 2004). Next, we pinpoint the difference between



the behaviour of *PhySIC* and that of well-known supertree methods on a biological case study on Primates. Lastly, we illustrate *PhySIC* on the reconstruction of the primate supertree at the genus level from various source trees based on mitochondrial DNA, nuclear DNA and jumping gene sequences. The supertree reconstructed appears to be useful for displaying phylogenetic relationships among the major primate taxa (Goodman et al., 2005), and for highlighting area of the primate tree that will require denser taxonomic and genetic sampling to achieve better resolution.

## Non-contradiction and induction properties

We first introduce vocabulary and notations required to formally define the properties of *non-contradiction* (PC) and of *induction* (PI). Simple examples are then used to illustrate the relevance of PC and PI as well as to relate them with previously proposed properties for supertree methods (Steel et al., 2000; Goloboff and Pol, 2002). Then we show how to check in polynomial time whether a supertree satisfies PC and PI for a given collection of source trees.

## Topological description of trees

The definitions and notations used for trees and their topological description are mainly the same as those used by Sempel and Steel (2003). We only consider rooted phylogenies, due to the fact that supertree methods cannot fulfill different desirable properties listed in Steel et al. (2000) when considering unrooted trees. Hereafter, the terms *phylogeny* and *tree* are considered synonymous. Given a tree  $T$ ,  $L(T)$  denotes the set of taxa associated to its leaves. More generally, given a collection  $\mathcal{T}$  of trees,  $L(\mathcal{T})$  denotes the set of taxa appearing in at least one tree of  $\mathcal{T}$ . Given two phylogenies  $T$  and  $T'$  on the same leaf set ( $L(T) = L(T')$ ), we say that  $T$  *refines*  $T'$

whenever  $T$  contains all clades of  $T'$ . In other words, either  $T$  and  $T'$  are identical or  $T$  can be transformed into  $T'$  by collapsing some of its internal edges.

A rooted tree on three leaves  $A, B, C$  has only three possible binary shapes, called *triplets* and denoted by  $AB|C$ , resp.  $AC|B$ , resp.  $BC|A$ , depending on the innermost clade ( $AB$ , resp.  $AC$ , resp.  $BC$ ). Given a triplet  $t$ ,  $\bar{t}$  denotes any of the two other triplets on the same set of leaves. Alternatively, a tree on three leaves can be a star tree, i.e. a unique internal node connected to the leaves. Any rooted tree  $T$  can be equivalently described by the set of triplets homeomorphic to subtrees of  $T$  connecting three leaves (e.g. Grunewald et al., 2006),  $rt(T)$  denotes this set. Given a collection  $\mathcal{T}$  of phylogenies,  $rt(\mathcal{T}) = \bigcup_{T_i \in \mathcal{T}} rt(T_i)$  denotes the set of triplets present in these phylogenies. Note that it is possible that  $rt(\mathcal{T})$  contains two triplets  $t$  and  $\bar{t}$ , namely when  $\mathcal{T}$  hosts two incompatible phylogenies. Clearly, two such triplets can not be combined into a single supertree of the collection.

Given a set  $\mathcal{R}$  of triplets,  $L(\mathcal{R})$  denotes the set of taxa appearing in at least one tree in  $\mathcal{R}$ . A tree  $T$  is said to *display* a set  $\mathcal{R}$  of triplets when  $\mathcal{R} \subseteq rt(T)$ ; moreover,  $T$  *strictly displays*  $\mathcal{R}$  if additionally  $L(T) = L(\mathcal{R})$ . A set  $\mathcal{R}$  of triplets is *compatible* if there is a tree  $T$  that displays  $\mathcal{R}$ . To find a tree displaying  $\mathcal{R}$ , it is useful to take into account that some triplets of the tree are *induced* by  $\mathcal{R}$ : a compatible set  $\mathcal{R}$  of triplets *induces* a triplet  $t$ , denoted by  $\mathcal{R} \vdash t$ , if and only if  $\mathcal{R} \cup \{\bar{t}\}$  is not compatible, or equivalently if any tree  $T$  that displays  $\mathcal{R}$  contains  $t$ . For instance, any tree displaying  $\{AB|C, BC|D\}$  also has to display the triplet  $AC|D$ , i.e.  $\{AB|C, BC|D\} \vdash AC|D$ . Bandelt and Dress (1986) and Dekker (1986) were among the first to investigate such induction rules. The set of all triplets induced by a compatible set  $\mathcal{R}$  is called the *closure* of  $\mathcal{R}$  and is denoted by  $cl(\mathcal{R})$ . Source trees considered for supertree building are sometimes incompatible, and then the set of triplets considered is incompatible. Nonetheless, we can characterize the set of triplets induced by these collections by extending the preceding definition: we will say that a set

$\mathcal{R}$  of triplets *induces* a triplet  $t$  when there is a compatible subset  $\mathcal{R}'$  of  $\mathcal{R}$  that induces  $t$ .

## Characterizing non-contradiction and induction by triplets

Here we describe two important properties that veto method supertrees should satisfy. They concern topological relationships that a supertree should not contain with respect to the input trees : first, it should not contain relationships *contradicting* the source trees (PC property); moreover, it should only contain relationships that are *induced* by the input trees (PI property). Below we detail these two properties.

There are several ways for a supertree to contradict a collection of source trees. The most direct contradiction occurs when only one resolution appears for a group of taxa in one or several source trees, and the supertree contains a different resolution for the group. When different resolutions appear in source trees, as soon as the supertree proposes a resolution for the concerned taxa it contradicts at least one input tree. Contradictions are less direct when the supertree proposes a resolution that contradicts no single input tree but does contradict a combination of them.

A relationship contained in a supertree can present no contradiction with the input trees and still not be desirable. For instance, Fig. 1 shows a collection of two source trees and four possible supertrees,  $T'$ ,  $T''$ ,  $T'''$  and  $T$ , for this collection. Both  $B$  and  $C$  are sister taxa of  $A$  in the source trees, but no information is present in these trees to resolve the clade  $A, B, C$ . Thus, the fully resolved supertrees  $T', T'', T'''$  all take arbitrary decisions by proposing one of the possible resolutions for this clade. Here,  $T$  is the sole supertree not proposing an arbitrary resolution for the clade. In general, the presence of arbitrary resolutions is favored by a low degree of actual overlap between the input trees. Arbitrary resolutions are misleading as they display relationships

that are not entailed by the input trees.

The above properties can be formalized in different ways depending on the kind of topological relationship considered, e.g. clades, nestings, triplets, etc. Following Goloboff and Pol (2002) and Grunewald et al. (2006), we chose to focus on triplets. Given a collection  $\mathcal{T}$  of input trees and a candidate supertree  $T$ ,  $\mathcal{R}(T, \mathcal{T})$  denotes the set of triplets of  $\mathcal{T}$  for which  $T$  proposes a resolution. More formally,  $\mathcal{R}(T, \mathcal{T}) = \{AB|C \in rt(\mathcal{T}) \text{ such that } \{AB|C, AC|B, BC|A\} \cap rt(T) \neq \emptyset\}$ . The set  $\mathcal{R}(T, \mathcal{T})$  corresponds to all topological information present in collection  $\mathcal{T}$  that is related to the information present in supertree  $T$ . Using this notation, we can express the induction property (PI) and the non-contradiction property (PC) as follows:

- $T$  satisfies PI for  $\mathcal{T}$  if and only if for all  $t \in rt(\mathcal{T})$ , it holds that  $\mathcal{R}(T, \mathcal{T}) \vdash t$ . In other words, PI requires that each and every triplet of  $T$  is induced by  $\mathcal{R}(T, \mathcal{T})$ .
- $T$  satisfies PC for  $\mathcal{T}$  if and only if for all  $t \in rt(\mathcal{T})$  and all  $\bar{t}$ , it holds that  $\mathcal{R}(T, \mathcal{T}) \not\vdash \bar{t}$ . This means that, for each and every triplet of  $T$ ,  $\mathcal{R}(T, \mathcal{T})$  induces no alternative resolution.

For instance, considering collection  $\mathcal{T} = \{T_1, T_2\}$  in Fig. 2 and supertree  $T'$  of Fig. 3, the set  $\mathcal{R}(T', \mathcal{T})$  is  $\{AC|E, AC|F, AB|E, AB|F, BC|E, BC|F, EF|A, EF|B, EF|C\}$ . Note that the triplet  $AD|C$  present in  $rt(\mathcal{T})$  due to  $T_2$  is not in this set because  $A, D, C$  are multifurcating in  $T'$ . When the source trees are incompatible, it is possible that  $\mathcal{R}(T, \mathcal{T})$  contains two different triplets for the same three taxa. For example, consider the supertree  $T$  in Fig. 3 proposed by the MC and MMC voting methods (Semple and Steel, 2000; Page, 2002) on the collection  $\mathcal{T} = \{T_1, T_2\}$ .  $\mathcal{R}(T, \mathcal{T})$  contains both  $AB|C$  (resulting from  $T_2$ ) and  $AC|B$  (resulting from  $T_1$ ). In this case, the supertree  $T$  that contains the triplet  $t = AB|C$  does not satisfy PC, since  $\bar{t} = AC|B$  is in  $\mathcal{R}(T, \mathcal{T})$  (hence,  $\mathcal{R}(T, \mathcal{T}) \vdash \bar{t}$ ). Indeed, in this example, supertree  $T$  includes topological information contained in  $T_2$  that contradicts that of  $T_1$ . This situation indirectly results from a difference in

the sizes of the clades of  $T_1$  and  $T_2$  which are incompatible: the clade containing more taxa (here  $(A, B, D)$  in  $T_2$  versus  $(A, C)$  in  $T_1$ ) is favored in the MC-MMC supertree. Such a size bias effect has been well-known in the field since Purvis (1995b) demonstrated it for the MRP voting method. Here it is illustrated for another voting method, and one might wonder whether this size bias is present in most voting methods. Note however that this size bias does not seem to have a major impact on MRP's accuracy (Baum and Ragan, 2004).

When the source trees are compatible, any reasonable method is expected to produce a supertree satisfying PC. However, some methods may propose a supertree that does not satisfy PI. Indeed, compatible source trees can sometimes be displayed by an exponential number of supertrees, and a first solution is to only output one of them, thus selecting some triplets to the exclusion of other possible triplets. An alternative is to output a consensus of all possible supertrees, as is usually done with MRP (e.g. Bininda-Emonds and Bryant, 1998). Unfortunately, some topological information of the source trees (e.g. triplets) can be absent from the obtained consensus when it contains multifurcating nodes.

However, for some compatible collections of trees, it is possible to find a supertree that displays all triplets of the collection and is also refined by all other possible supertrees. More formally, a set  $\mathcal{R}$  of triplets is said to *identify* a tree  $T$  if and only if  $T$  strictly displays  $\mathcal{R}$  and  $T$  is refined by every tree  $T'$  that strictly displays  $\mathcal{R}$ . A set  $\mathcal{R}$  can identify at most one tree, thus when the triplet set  $\mathcal{R} = rt(\mathcal{T})$  of a collection  $\mathcal{T}$  of source trees identifies a tree, this tree is a *canonical* representation of all possible supertrees.

Considering practical collections  $\mathcal{T}$  of source trees,  $rt(\mathcal{T})$  will almost never identify a tree, either because this set is incompatible, or because it does not identify a particular tree. Nevertheless, it is possible that a subset of the triplets in  $rt(\mathcal{T})$  identifies a tree  $T$ , and then the topological information contained in  $T$  exactly corresponds to a subset of the topological information con-

tained in  $\mathcal{T}$ . Such a subset is most interesting when the triplets  $t$  it contains do not have an alternative resolution  $\bar{t}$  in  $rt(\mathcal{T})$ . This situation occurs for the subset  $\mathcal{R}(T, \mathcal{T})$  of  $rt(\mathcal{T})$  when the supertree  $T$  satisfies PI and PC.

**Proposition 1** *A tree  $T$  satisfies PI and PC for a collection  $\mathcal{T}$  of trees if and only if  $\mathcal{R}(T, \mathcal{T})$  identifies  $T$ .*

The proof is given in Appendix. It is based on the fact that a set  $\mathcal{R}$  identifies a tree  $T$  if and only if  $rt(T) = cl(\mathcal{R})$  (Grunewald et al., 2006, Lem. 2.1). This proposition confirms the relevance of PI and PC: having a supertree  $T$  that satisfies both of them highlights a part of  $rt(\mathcal{T})$  (namely  $\mathcal{R}(T, \mathcal{T})$ ) that exactly corresponds to a tree, i.e. does not contain arbitrary topological information, and moreover does not contradict any input tree. Such a feature is most desirable for supertrees inferred by veto methods.

## Links with other advocated properties

Properties similar to PI and PC were described in (Goloboff and Pol, 2002, p.519) as “the property of [the supertree] displaying  $AB|C$  if it is found in some input tree or implied by some combination of input trees and no input tree or combination of input trees displays or implies  $AC|B$  or  $BC|A$ ”. These properties were also pointed out as being desirable by Grunewald et al. (2006). Using our formalism, they can be translated as follows for a supertree  $T$  representing a collection  $\mathcal{T}$ :

- $PI'$ : for any  $t \in rt(T)$ , it holds that  $rt(\mathcal{T}) \vdash t$
- $PC'$ : for any  $t \in rt(T)$  and for all  $\bar{t}$ , it holds that  $rt(\mathcal{T}) \not\vdash \bar{t}$ .

The essential difference between PI'-PC' and PI-PC is whether we evaluate supertrees based on triplets in the original set of trees,  $rt(\mathcal{T})$ , or on the triplets commonly resolved the supertree

and at least one of the source trees,  $\mathcal{R}(T, \mathcal{T})$ . From the statement of the properties, it is clear that  $\text{PC}'$  implies  $\text{PC}$  and  $\text{PI}$  implies  $\text{PI}'$ . It is thus natural to wonder which version of the properties is preferable. Below, we show an example where  $\text{PC}'$  is too restrictive, and an example where  $\text{PI}'$  is too permissive. In contrast,  $\text{PI}$  and  $\text{PC}$  behave correctly in these examples.

**Example 1** Let  $\mathcal{T} = \{T_1, T_2\}$  with  $T_1$  and  $T_2$  as shown in Fig. 4.  $rt(\mathcal{T})$  contains  $AE|B$  and  $AC|E$ , therefore  $rt(\mathcal{T}) \vdash AC|B$ . We also have  $rt(\mathcal{T}) \vdash AB|C$  since  $AB|C \in rt(T_1)$ . Thus any tree providing a triplet on  $\{A, B, C\}$  does not satisfy  $\text{PC}'$ . For analogous reasons  $\text{PC}'$  does not allow us to propose any triplet in the supertree. Thus  $\text{PC}'$  rejects the tree  $T$  of Fig. 4. Yet  $T$  is a reasonable and informative supertree for  $\mathcal{T}$  and satisfies both  $\text{PI}$  and  $\text{PC}$ .

We note that  $T$  is not a plenary supertree, i.e. it does not contain all input taxa, but this example shows that removing rogue taxa is a way in which more informative supertrees can be obtained. This is in line with the remark of Wilkinson et al. (2004), who stated that “non-plenary supertree methods might be most useful for identifying unstable leaves”. For instance, such leaves might be involved in lateral transfers. This example easily generalizes to cases where the *supertree* actually contains more leaves than each source tree. Figure 5 depicts this generalization.

The next example shows a supertree satisfying both  $\text{PI}'$  and  $\text{PC}'$ , while also displaying irrelevant triplets.

**Example 2** Let  $\mathcal{T} = \{T_1, T_2\}$  with  $T_1$  and  $T_2$  as illustrated in Fig. 6.  $rt(\mathcal{T}) = \{AB|C, AB|X, BC|A\}$ . The tree  $T$  of Fig. 6 displays  $\{AB|X, BC|X, AC|X\}$ .  $AB|X$  is present in (thus induced by)  $rt(\mathcal{T})$  but surprisingly the two other triplets can also be induced from  $rt(\mathcal{T})$ :  $\{AB|X, BC|A\} \vdash \{BC|X, AC|X\}$ . It follows that  $T$  satisfies  $\text{PI}'$ . Moreover, it is easily seen that no combination of triplets in  $rt(\mathcal{T})$ , other than  $\{AB|X, BC|A\}$ , induces triplets. Thus  $T$  also satisfies  $\text{PC}'$ . However,  $T$  is clearly not an ideal supertree for  $\mathcal{T}$  as no information in  $\mathcal{T}$  induces group  $A, B, C$  to nest

inside group  $A, B, C, X$ . The property  $PI$ , not satisfied by  $T$ , detects this problem: here  $\mathcal{R}(T, \mathcal{T})$  only contains the triplet  $AB|X$  and thus it does not induce the triplet  $AC|X$  present in  $T$ .

The  $PI$  property quoted by Goloboff and Pol (2002) is stronger than the *Pareto* property (Neumann, 1983; Wilkinson et al., 2004) on triplets, which requires that the output tree contain all triplets that occur in all source trees. Pareto property is appealing in general and has also been advocated in the supertree context (property P6 of Steel et al., 2000). However imposing the Pareto property on triplets may be problematic, even in the case of compatible source trees (Thorley and Wilkinson, 2003). This is due to the possibility of having *several* candidate supertrees that are both compatible with source trees and respect the Pareto property. In this case, no *single* supertree exists that satisfies the Pareto property while having no arbitrary resolution. The strict consensus of these supertrees does not necessarily satisfy the Pareto property. A solution is then to return several trees, either all candidate supertrees or their reduced consensus (Wilkinson, 1994). However, this solution may not well be suited when the aim is to summarize a collection of source trees into a single supertree that is more easily dealt with for further analysis by biologists.

When source trees are incompatible, it may even be impossible to have a supertree satisfying both the Pareto and non-contradiction properties ( $PC$  and  $PC'$ ). The following details such a surprising example.

**Example 3** Consider the collection  $\mathcal{T} = \{T_1, T_2\}$  where  $T_1 = (((A, D), B), ((C, F), E))$  and  $T_2 = (((A, E), (B, F)), (C, D))$ . Triplets  $AB|C$  and  $EF|D$  are displayed by both trees of  $\mathcal{T}$ . Thus any supertree  $T$  for  $\mathcal{T}$  must include all leaves in  $\mathcal{T}$  in order to satisfy the Pareto property. Since  $rt(\mathcal{T})$  contains  $AB|D$  and  $AD|B$ , any tree  $T$  displaying a triplet for the three leaves does not satisfy  $PC$  (hence  $PC'$ ). For similar reasons, no supertree  $T$  can display a triplet on the taxa  $A, C$  and  $D$ . Thus, any supertree satisfying  $PC$  (or  $PC'$ ) and including all taxa of  $\mathcal{T}$  contains a multifurcating



node on taxa  $A, B, C, D$ , hence does not display the triplet  $AB|C$ , i.e. does not satisfy the Pareto property.

In other words, imposing the Pareto property can lead the supertree to explicitly contradict relationships present in some input trees. This shows that the Pareto property on triplets is not compatible with the veto approach, where the proposed supertree must not contradict the source trees. However, the Pareto property can be considered for other topological relationships (Wilkinson et al., 2004). For example, there is always a supertree satisfying PI and PC as well as the Pareto property on partial or full splits contained in the source trees.

The Pareto property specifies relations that the supertree *must* contain. The complementary co-Pareto property specifies relations that the supertree *must not* contain. The co-Pareto property in the consensus context requires that the consensus tree contain no relationships that are not present in at least one input. However, Wilkinson et al. (2004) point out that this statement is not reasonable for supertrees, since “they might contain relationships that are entailed by the input trees in combination, but are not present in any of them singly”. Then they propose a weaker version that requires that the supertree does not contain relationships that are contradicted by all the input trees whose leaf set makes a contradiction possible. Note that, any supertree satisfying PC also satisfies the latter version of co-Pareto.

Steel et al. (2000) list five other properties that might be requested from supertree methods: changing the order of the trees in the input collection does not change the supertree (P1); renaming the taxa of the source trees gives the same supertree, but with the taxa renamed accordingly (P2); the output tree displays the source trees when they are compatible (P3); each leaf (taxon) that occurs in at least one source tree is in the supertree (P4); the running time of the method grows polynomially with respect to the total number of taxa (P5). First note that any non-plenary

supertree method does not satisfy the P4 property. The following example shows that ensuring P3 can force the supertree to contain arbitrary clades. Thus P3 can conflict with PI.

**Example 4** Let  $\mathcal{T} = \{T_1, T_2\}$  with  $T_1 = ((A, B), W)$  and  $T_2 = ((A, B), (X, (Y, Z)))$ . A supertree with taxon set  $\{A, B, W, X, Y, Z\}$  that satisfies P3 must display  $T_2$ , hence must have a clade including  $Y, Z$  but not  $X$ . However, it will contain arbitrary clades, no matter where taxon  $W$  is attached. This is because any supertree satisfying PI must include a polytomy on  $W, X, Y, Z$  since source trees include no information on the relative position of  $W$  and the group  $X, Y, Z$ . For instance, the supertree  $((A, B), (X, Y), C, Z)$  excludes the possibility for  $(A, B)$  and  $(X, Y)$  to be intermixed.

Note that if polytomies of a supertree are interpreted in terms of an Adams consensus (Adams, 1972), then this example does not put P3 into question. However, this interpretation of polytomies does not prevail in phylogenetics, as we discuss in further detail in the case study paragraph.

## Checking PC and PI in polynomial time

Existing supertree methods can sometimes output trees that do not satisfy PC or PI. For instance, the MC supertree obtained for the collection of Fig. 2 does not satisfy PC, while on that of Example 4, it fails to satisfy PI. In contrast, for the collection  $\{AB|C, BC|D\}$  the MC supertree satisfies both PI and PC. The MRP method sometimes outputs supertrees not satisfying these properties (e.g. PC is not satisfied in Fig. 1 of Bininda-Emonds and Bryant, 1998), and sometimes provides supertrees that satisfy them – e.g. when the source trees are compatible (Steel, 1992). We now describe an algorithm to decide whether a candidate supertree satisfies both PI and PC together. In case of a negative answer, it pinpoints parts of the supertrees to be doubted. This algorithm relies on two properties equivalent to PC and PI, whose formulation is

less intuitive but whose checking is easy.

**Definition 1** Let  $\mathcal{T}$  be the collection of source trees and  $T$  be a proposed supertree for  $\mathcal{T}$ . Define  $PC_{eq}$  and  $PI_{eq}$  to be the following properties:

- $PC_{eq}$ :  $rt(T) \cup \mathcal{R}(T, \mathcal{T})$  is compatible.
- $PI_{eq}$ : for any  $t \in rt(T)$  and for all  $\bar{t}$ , the set  $\{\bar{t}\} \cup \mathcal{R}(T, \mathcal{T})$  is incompatible.

**Proposition 2**  $(PI_{eq} \text{ and } PC_{eq}) \Leftrightarrow (PI \text{ and } PC)$ .

*Proof.*

- **$PC_{eq} \Rightarrow PC$** :  $PC_{eq} \Rightarrow \forall t \in rt(T), \{t\} \cup \mathcal{R}(T, \mathcal{T})$  is compatible. This ensures that there is at least one tree  $T'$  that displays  $\mathcal{R}(T, \mathcal{T}) \cup \{t\}$ . It follows that  $T'$  displays  $\mathcal{R}(T, \mathcal{T})$  but not  $\bar{t}$ . As  $\bar{t}$  is not displayed by every tree that displays the compatible set  $\mathcal{R}(T, \mathcal{T})$ , it follows that  $\mathcal{R}(T, \mathcal{T}) \not\vdash \bar{t}$ .
- **$PC \Rightarrow PC_{eq}$** :  $PC \Rightarrow \mathcal{R}(T, \mathcal{T}) \subseteq rt(T)$  (cf proof of Prop. 1), this ensures that  $rt(T) \cup \mathcal{R}(T, \mathcal{T})$  is compatible (since displayed by  $T$ ).
- **$PI + PC \Rightarrow PI_{eq}$** :  $PI$  and  $PC \Rightarrow cl(\mathcal{R}(T, \mathcal{T})) = rt(T)$  by Prop. 1. This ensures  $PI_{eq}$ .
- **$PI_{eq} + PC_{eq} \Rightarrow PI$** :  $PC_{eq}$  ensures that  $\mathcal{R}(T, \mathcal{T})$  is compatible.  $PI_{eq}$  is exactly the definition of the induction for a compatible set, thus ensuring  $PI$ .

□

Note that we do not prove a direct equivalence between  $PI$  and  $PI_{eq}$  in this general case. The two properties are only equivalent for a compatible set. In fact,  $PI_{eq}$  is relatively uninformative without  $PC_{eq}$ , since  $PI_{eq}$  holds as soon as  $\mathcal{R}(T, \mathcal{T})$  is incompatible. Note also that another formulation of

PC, closer to that of  $\text{PI}_{eq}$  but less concise, is as follows: *for any  $t \in \text{rt}(T)$ , the set  $\{t\} \cup \mathcal{R}(T, \mathcal{T})$  is compatible.*

$\text{PI}_{eq}$  and  $\text{PC}_{eq}$  can easily be checked by using the *Build* algorithm (Aho et al., 1981), which indicates in polynomial time whether a set of rooted trees is compatible or not. A similar procedure was proposed by Steel (1992), and refined by Daniel (2004), to compute the strict consensus of all supertrees displaying a collection of compatible source trees. The following lemma provides us with an even faster way to check  $\text{PC}_{eq}$ .

**Definition 2 (Direct contradiction)** *A tree  $T$  directly contradicts a set of triplets  $\mathcal{R}$  when there is a triplet  $t$  in  $\text{rt}(T)$  such that  $\exists \bar{t} \in \mathcal{R}$ . A supertree  $T$  is said to directly contradict a collection  $\mathcal{T}$  of source trees if  $T$  directly contradicts  $\text{rt}(\mathcal{T})$ .*

Direct contradictions are linked with the PC property in the following way:

**Lemma 1** *If a tree  $T$  does not directly contradict a collection  $\mathcal{T}$  of source trees then the three following statements hold:*

1.  $\mathcal{R}(T, \mathcal{T}) \subseteq \text{rt}(T)$ ;
2.  $\mathcal{R}(T, \mathcal{T})$  is compatible;
3.  $T$  satisfies  $\text{PC}_{eq}$  for  $\mathcal{T}$ .

*Proof.* By definition,  $\mathcal{R}(T, \mathcal{T})$  only contains triplets on 3-taxon sets for which there is a triplet in  $\text{rt}(T)$ . Since  $T$  does not directly contradict  $\mathcal{T}$ , the triplets of  $\mathcal{R}(T, \mathcal{T})$  are resolved as those in  $T$ . It follows that  $\mathcal{R}(T, \mathcal{T}) \subseteq \text{rt}(T)$  (proving 1).  $\mathcal{R}(T, \mathcal{T})$  is therefore compatible (proving 2). Moreover,  $\mathcal{R}(T, \mathcal{T}) \subseteq \text{rt}(T)$  ensures that  $\mathcal{R}(T, \mathcal{T}) \cup \text{rt}(T)$  is compatible, which is exactly the formulation of  $\text{PC}_{eq}$  (proving 3). □

Thus, to check that a supertree  $T$  satisfies  $\text{PC}_{eq}$ , and hence PC, for a collection  $\mathcal{T}$ , it suffices

to check that any triplet of  $rt(T)$  is not resolved in a different way in a tree of  $\mathcal{T}$ . This can be done by computing the set  $rt(T)$  of  $O(n^3)$  triplets in  $T$  and then comparing  $rt(T)$  with the set of triplets of each source tree  $T_i$ . If the collection  $\mathcal{T}$  contains  $k$  source trees and a total of  $n$  taxa, then this simple implementation requires  $O(kn^3)$  computing time. However, it is possible to check this condition in linear time for each pair  $T, T_i$  with  $T_i \in \mathcal{T}$ : first restrict in  $O(n)$  time the trees  $T$  and  $T_i$  to the taxa they share; then apply the algorithm of Berry et al. (2005) that, given two trees with the same taxa, finds in  $O(n)$  time a triplet resolved differently in the trees, or states that this situation does not arise. Thus, successively considering  $k$  source trees leads to a procedure that checks PC in  $O(kn)$  computing time.

## ***PhySIC* : a veto polynomial-time supertree method**

We introduced above the PI and PC properties, showed their relevance and described algorithms to check whether a given supertree  $T$  satisfies them. In this section, we show that it is possible to design a method that always produces supertrees that satisfy PI and PC. However, this aim is not precise enough, as the *star tree* (the tree whose leaves are all children of a single internal node) trivially satisfies these properties – simply because it does not resolve any triplet. Thus, a reasonable aim is to design a method that always infers supertrees that satisfy PI and PC *and* that contain as much resolution as possible, e.g. resolve as many triplets as possible. More precisely, we require a method that, given any collection  $\mathcal{T}$ , proposes a supertree  $T$  such that  $\mathcal{R}(T, \mathcal{T})$  identifies  $T$  and  $\mathcal{R}(T, \mathcal{T})$  has maximum size over all such subsets of  $rt(\mathcal{T})$ . Such a subset of  $rt(\mathcal{T})$  is called a maximum identifying subset of triplets (MIST).

The difficulty of this problem cannot be simply deduced from previously known theoretical results for optimization problems on triplets. Indeed, the MIST problem is a middle term be-

tween the NP-hard problem that consists of finding a maximum-sized *compatible* subset of triplets (Bryant, 1997) and the polynomial-time problem that asks for the maximum-sized *tree-like* subset of a complete set of triplets (Berry and Gascuel, 2000; Bryant and Berry, 2001). Unfortunately, the MIST problem is NP-hard (Guillemot and Berry, 2007). This shows that it is highly unlikely that a polynomial-time algorithm exists that could find the most resolved supertree satisfying PI and PC. However, we can still rely on heuristic algorithms to find reasonable (but potentially suboptimal) solutions, as is commonly done for other NP-hard problems such as finding a most parsimonious tree or a maximum likelihood tree for a character matrix.

We present below a polynomial-time heuristic method that always outputs a supertree that satisfies PI and PC. The method tries to produce a supertree that contains as many input triplets as possible under this constraint. The method is a variant of the well-known *Build* algorithm (Aho et al., 1981) and is called *PhySIC*– *Phylogenetic Signal with Induction and non-Contradiction* – as it infers supertrees that satisfy PI and PC. Supertrees inferred by the method have a degree of resolution that can be close to that of supertrees inferred by voting methods (see next section), while only containing clades that are not arbitrary with respect to the source trees nor contradicting them as detected by PC.

## **Inferring a supertree that satisfies PC**

This section introduces algorithms to produce non-trivial trees that satisfy PC. These algorithms are based on the *Build* algorithm (sometimes also called *OneTree*) according to Aho et al. (1981). This algorithm was already mentioned in previous section as a tool to check whether PC holds for a given tree.

## The *Build* algorithm

The *Build* algorithm is a yes-or-no algorithm that tells whether a collection of triplets or larger trees is compatible or not. To achieve its goal, the algorithm tries to build a tree displaying the triplets; if the process is blocked at some step, this means that the input triplets are not compatible. This tree is built recursively, from the root to the leaves. First, the largest clades are identified, then clades included in the first ones, and so on. The composition of the clades is guided by the structure of a *graph*, that is a set of objects (called *vertices*) with links (called *edges*) between pairs of them.

The graph used by *Build*, called here the *Aho Graph*, is defined as follows: let  $\mathcal{R}$  be a collection of triplets on a taxon set  $X$ , the *Aho Graph*  $G$  for  $\mathcal{R}$  is the undirected graph with vertices  $X$  and with edges  $(A, B)$  between two taxa  $A$  and  $B$  whenever there is a triplet  $AB|C \in \mathcal{R}$ . Thus, an edge between two taxa means that at least one triplet sees these two taxa in the same clade. The vertices of  $G$  are denoted by  $v(G)$  (in the present description  $v(G) = X$ ). For instance, Fig. 7a shows the Aho graph built from  $\mathcal{R} = rt(\{T_1, T_2\})$ , where  $T_1, T_2$  are the source trees of Fig. 2, and e.g. the edge between taxa  $B$  and  $D$  is due to the triplet  $bd|c \in rt(T_2)$ .

A *connected component*  $C_i$  of a graph is a maximal set of taxa linked to one another, i.e. such that for any pair  $A, B$  of taxa in  $C_i$ , there is a set of edges that links  $A$  to  $B$ . For instance, the graph in Fig. 7a contains two connected components:  $C_1 = \{E, F\}$  and  $C_2 = \{A, B, C, D\}$ . The connected components of graph  $G$  are denoted by  $CC(G)$ . The vertices of a component  $C_i$  of  $G$  are denoted by  $v(C_i)$ . When the Aho graph contains several connected components, each of them corresponds to a clade of the tree representing the input collection of triplets (if such a tree exists). Once these clades are known, the clades contained in each of these primary clades are found by recursively processing Aho graphs for subsets of triplets that respectively concern

the taxa of these clades: the restriction of  $\mathcal{R}$  to taxa of a component  $C_i$  is denoted by  $\mathcal{R}|v(C_i)$  and defined as  $\{AB|C \in \mathcal{R} \text{ such that } \{A, B, C\} \subseteq v(C_i)\}$ . For example Fig. 7b shows the Aho graph obtained from  $\mathcal{R}|v(C_2)$  where  $\mathcal{R}$  is the set of triplets due to source trees in Fig. 2, and  $C_2$  is the component of the initial Aho graph shown in Fig. 7a. The recursive calls stop when dealing with components containing less than 3 taxa, since there is no triplet (hence incompatibility) on so few taxa. However, if at some point in the recursive process, the Aho graph for a set of at least three taxa has only one connected component, this means that the input trees are conflicting on the resolution of these taxa. When this happens, the algorithm states that the collection of source trees is incompatible. Otherwise, when all recursive calls return, the algorithm concludes that the source trees are compatible. For instance, when run on the collection of Fig. 2, *Build* first finds two connected components,  $C_1 = \{E, F\}$  and  $C_2 = \{A, B, C, D\}$ , but the recursive call on  $C_2$  leads to a graph containing only one connected component (Fig. 7b), which leads the algorithm to detect the incompatibility of the source trees.

### A first simple modification of *Build*

We first describe here a simple modification of *Build* that infers a supertree from a collection of source trees  $\mathcal{T}$ . This subroutine, called *Build<sub>PC</sub>* (see Fig. 8), takes as input the triplet set  $\mathcal{R} = rt(\mathcal{T})$  of a collection  $\mathcal{T}$  of source trees and the list  $S$  of taxa contained in these trees. *Build<sub>PC</sub>* mainly differs from *Build* when the Aho graph contains one connected component on the set  $S$  of taxa currently considered (line 1). In this case, *Build<sub>PC</sub>* returns the star tree on  $S$  (i.e. a single polytomy on  $S$ , thus contradicting no input triplet), whereas *Build* simply concludes that the sources trees are incompatible. This star tree is then grafted as a subtree of the tree built by the previous recursive call. Thus, we can now output a supertree even when the source trees are incompatible. As an example, from the collection of Fig. 2, *Build<sub>PC</sub>* infers the supertree  $T'$



displayed in Fig. 3.

**Proposition 3** *Given a collection  $\mathcal{R}$  of triplets on a taxon set  $S$ ,  $Build_{PC}$  returns a tree  $T$  on  $S$  that satisfies the PC property for  $\mathcal{R}$ .*

The proof of this proposition can be found in appendix.

### A more involved algorithm to infer a supertree satisfying PC

$Build_{PC}$  sometimes produces poorly resolved trees due to multifurcations returned in cases where  $G$  contains a single connected component (i.e. when  $\mathcal{R}$  contains conflicts covering the considered subset of taxa). In the most extreme (though unlikely) case, this situation occurs at the first step of the algorithm, which then outputs a star tree.

The most basic conflicts between triplets of  $\mathcal{R}$  occurs when two different triplets  $t$  and  $\bar{t}$  appear in  $\mathcal{R}$  for a same set of three taxa. Such a direct contradiction cannot be present in a tree that satisfies PC. Given  $\mathcal{R}_{dc}$ , the set of triplets s.t.  $t, \bar{t} \in \mathcal{R}$  it seems relevant to consider the subset  $\mathcal{R}' = \mathcal{R} - \mathcal{R}_{dc}$ . We define a variant of  $Build_{PC}$ , called  $PhySIC_{PC}$ , that resorts to that subset whenever conflicts are detected. This enables the produced supertree  $T'$  to be generally much more resolved than the tree returned by  $Build_{PC}$ . For instance, Fig. 7b shows the graph obtained for  $\mathcal{R}|v(C_2)$ , where  $\mathcal{R}$  are triplets of the collection in Fig. 2 and  $C_2$  is the connected component shown in Fig. 7a. This graph is connected due to the direct conflicts between  $AB|C$  (resulting from  $T_1$ ) and  $BC|A$  (resulting from  $T_2$ ). This situation leads  $Build_{PC}$  to return a polytomy on  $A, B, C, D$ . In contrast, building the graph on the basis of  $\mathcal{R}'$  results in two connected components,  $C_i$  and  $C_j$ , allowing  $PhySIC_{PC}$  to propose a tree with two subtrees for taxa  $A, B, C, D$ .

The correctness of  $Build_{PC}$  ensures that  $T'$  satisfies PC w.r.t.  $\mathcal{R}'$  but without any guarantee that this also holds w.r.t.  $\mathcal{R}$ . To ensure the latter, and thus the correction of  $PhySIC_{PC}$ ,  $T'$  must

not resolve any triplet of  $\mathcal{R}_{dc}$ . A way to ensure this is to collapse any branch of  $T'$  that resolves a triplet of  $\mathcal{R}_{dc}$ . The tree thus obtained is still always at least as resolved as the one proposed by  $Build_{PC}$  and potentially contains supplementary branches. Indeed, direct contradictions at the root of a clade no longer prevent the proposition of clades on subsets of its taxa. For instance, on the collection of Fig. 2, the tree outputted by  $PhySIC_{PC}$  is the tree called  $T$  in Fig. 3. But as the branch leading to the clade  $(A, D, B)$  contradicts  $AC|B \in \mathcal{R}_{dc}$ , the branch above this clade is collapsed, and the tree output by  $PhySIC_{PC}$  is then the tree named  $T''$  in Fig. 3. This tree contains one clade more than the tree output by  $Build_{PC}$  (the tree named  $T'$  in the figure).

These ideas are included in the  $PhySIC_{PC}$  algorithm whose pseudo-code is detailed in Fig.9.

**Theorem 1** *Given a triplet set  $\mathcal{R} = rt(\mathcal{T})$  from a collection  $\mathcal{T}$  of source trees on a taxon set  $S$  of  $n$  leaves,  $PhySIC_{PC}$  returns in  $O(n^4)$  time a tree  $T$  satisfying PC for  $\mathcal{T}$ .*

The proof of this result can be found in appendix.

## Ensuring that the supertree satisfies PI

The supertree  $T_{PC}$  output by  $PhySIC_{PC}$  does not usually satisfy the PI property. The  $PhySIC_{PI}$  algorithm transforms  $T_{PC}$  so that it also satisfies PI. To that aim  $PhySIC_{PI}$  recursively searches the tree and checks that for each branch each triplet is induced by  $\mathcal{R}(T_{PC}, \mathcal{T})$ . The theorem 3.1.1 of Daniel (2004) provides a useful characterisation to decide when a branch is justified, directly or indirectly, thanks to triplets present in  $\mathcal{R}(T_{PC}, \mathcal{T})$ . When considering the branch linking  $u$  to a subtree  $S_i$ , the theorem considers a graph  $G_{ij}$  for any sibling subtree  $S_j$  of  $S_i$ . Any such graph  $G_{ij}$  is the Aho graph with vertices  $L(S_i)$ , and with edges due to triplets of  $\mathcal{R}(T_{PC}, \mathcal{T})$  whose three leaves are in  $L(S_i) \cup L(S_j)$ . The theorem states that the branch from  $u$

to the root of  $S_i$  is justified if and only if  $G_{ij}$  is connected, for any sibling subtree  $S_j$ .

**Example 5** Consider for instance the simple example where  $\mathcal{T}$  contains the trees  $((A,B),X)$  and  $((E,F),X)$ . The Aho graph for  $rt(\mathcal{T}) = \{AB|X, EF|X\}$  is made of three connected components:  $C_1 = \{A, B\}$ ,  $C_2 = \{E, F\}$  and  $C_3 = \{X\}$ , therefore applying the *PhySIC<sub>PC</sub>* algorithm gives the tree  $T_{PC} = ((A, B), (E, F), X)$ .  $T_{PC}$  displays  $AB|E$  even though this information is not induced by  $\mathcal{T}$ . Indeed, the branch defining the clade  $(A, B)$  is detected as not justified since the corresponding connected component,  $C_1$ , is not connected in the Aho graph when we consider only edges due to triplets with taxa in  $C_1 \cup C_2$ .

This Theorem is the basis of a *decision* algorithm called *Identifies*, that states whether a given set of triplets identifies a given tree (Daniel, 2004). It is possible to design a simple variant of this algorithm that always returns a tree (not just a *yes* or *no* answer): when a branch between a node  $p$  and the root of a subtree  $S_i$  is not justified, the idea is to replace  $S_i$  by a star tree on the taxa of the corresponding clade. This crude variant removes the unjustified branches, but also potentially many other branches, i.e. those inside  $S_i$ , those leading to sibling subtrees  $S_j$  of  $S_i$ , and those inside  $S_j$  subtrees. *PhySIC<sub>PI</sub>* is a more refined variant that only collapses the unjustified branches. See the pseudo-code in Fig. 10 for details. In this code, *PhySIC<sub>PI</sub>* is given a tree  $T$  in which unjustified branches are to be collapsed, and a collection  $\mathcal{T}$  of source trees or, equivalently, the corresponding set of triplets (as written in the pseudo-code). *PhySIC<sub>PI</sub>* repeatedly calls the *Check<sub>PI</sub>* subroutine to detect unjustified branches that are then removed until none remain. Note that in the pseudo-code of *Check<sub>PI</sub>*,  $S(T)$  denotes (complete) subtrees connected to the root of  $T$ , i.e. the subtrees corresponding to the largest clades under the root of  $T$ .

From the collection of Fig. 2, *PhySIC<sub>PC</sub>* infers the supertree  $T''$  displayed in Fig. 3. and none of the three internal branches of  $T''$  are collapsed by *Check<sub>PI</sub>*. For instance, consider the

step where  $Check_{PI}$  checks the subtree  $((A,D),B,C)$  of  $T''$ , whose child subtrees are  $(A,D)$  plus the two trivial subtrees on  $B$  and  $C$ . The sole branch that has to be checked in  $((A,D),B,C)$  is the one defining the clade  $(A,D)$ . Here,  $Check_{PI}$  builds two Aho graphs with vertices  $\{A, D\}$ : one with edges due to triplets on  $\{A, D\} \cup \{B\}$  and one with edges due to tripletson  $\{A, D\} \cup \{C\}$ . Both graphs are connected thanks to triplets of the source tree  $T_2$ , therefore,  $Check_{PI}$  does not collapse any branch at this step.

**Theorem 2** *Given a collection  $\mathcal{T}$  of trees and a tree satisfying PC for  $\mathcal{T}$ ,  $PhySIC_{PI}$  returns in  $O(n^4)$  time a tree  $T$  on  $L(\mathcal{T})$  that satisfies both PC and PI for  $\mathcal{T}$ .*

The proof of this Theorem can be found in the appendix.

The  $PhySIC$  algorithm (see pseudo-code) builds a supertree for a collection of  $k$  source trees  $\mathcal{T}$  by first computing the set  $rt(\mathcal{T})$  and then successively calling  $PhySIC_{PC}$  and  $PhySIC_{PI}$ . Since  $rt(\mathcal{T})$  is computed in  $O(kn^3)$ ,  $PhySIC$  runs in  $O(kn^3 + n^4)$  time.

**Theorem 3** *Given a collection  $\mathcal{T}$  of  $k$  source trees on  $n$  leaves,  $PhySIC$  returns in  $O(kn^3 + n^4)$  time a tree both satisfying PC and PI.*

Lastly, we note that similar procedures can be designed to modify the supertree proposed by any existing supertree method. If a method proposes a supertree  $T$  that does not satisfy PC and PI, it is possible in polynomial time to transform  $T$  into a tree  $T'$  that satisfies these properties. Indeed, the algorithm indicated previously to check PC indicates the triplets from which the incompatibility arises. Then the branches of  $T$  inducing these triplets can be collapsed to obtain a tree  $T'$  satisfying PC. Now, a procedure similar to  $PhySIC_{PI}$  can be applied to  $T'$  to ensure that it also satisfies PI (without invalidating PC).

## A biological case study

To illustrate the impact of the PC and PI properties on supertree inference, and to compare the behavior of veto methods like PhySIC and vote methods like MRP and MMC, we first present a simple case study centered on Primates. This mammalian order is one of the first taxonomic groups for which a supertree approach has been conducted (Purvis, 1995a).

### Source trees

We focused on a subsample of Primates IRBP (Interphotoreceptor Retinoid Binding Protein) and ADRA2B ( $\alpha$ 2B-Adrenergic Receptor) gene sequences, respectively from Poux and Douzery (2004) and Poux et al. (2006), with a rodent (*Mus*) and lagomorph (*Oryctolagus*) outgroup. For ADRA2B, the hominoid representative was *Pan*, with the sequence downloaded from the chimp ENSEMBL project. The ADRA2B and IRBP source trees were inferred by maximum likelihood (ML) analysis of the corresponding alignments, using PHYML (Guindon and Gascuel, 2003), version 2.4.4, under a GTR+ $\Gamma_4$ +INV model of DNA evolution. The node support was estimated after 1000 bootstrap replicates using the same software, and expressed as bootstrap percentages (BP). Denser taxonomic and phylogenetic information for Strepsirrhines (i.e. *Lemurs* and *Galagos*) was sought from a study of presence-absence of short interspersed nuclear elements (SINE) integrations in primate genomes (Roos et al., 2004, Fig. 2). Sixty-one monolocus SINE characters detected by these authors were subjected to a maximum parsimony search using PAUP\* (Swofford, 1998), version 4b10, with 1000 bootstrap replicates using a heuristic search, with 10 random additions of taxa, and TBR branch swapping. We only retained the best supported nodes of source trees, i.e. those showing at least 50% bootstrap (*cf.* also Daubin et al., 2002).

## Comparison of inferred supertrees

Starting from the three source trees (Fig. 11), supertrees were built using the MMC, MRP, and *PhySIC* methods. For MRP, the matrix representation of the three source topologies resulted in 47 characters. Parsimony analysis was conducted under PAUP\*, with a heuristic search with 1000 random additions of sequences, and TBR branch swapping, resulting in 864 equally parsimonious trees, a strict consensus of which provided the MRP supertree. The MMC supertree was obtained using the program distributed by Rod Page. Fig. 12 shows the supertrees respectively reconstructed by MMC, MRP, and *PhySIC* with its *PhySIC<sub>PC</sub>* intermediate step.

The produced supertrees all contain some polytomies. In order to fairly compare them, it is important to understand that the meaning of polytomies depends on the method that produced them. Polytomies in phylogenetic trees can be interpreted in different ways (Page and Holmes, 1998, chap. 2). First, a polytomy can represent a common ancestral population splitting through cladogenesis (i.e. speciation) into multiple lineages. In this case, the polytomy is usually said to be *hard*. Other interpretations mean that the polytomy is *soft*, i.e. that it represents an uncertainty for which resolution of the node's child subtrees or lineages is the best hypothesis. A soft polytomy can have two distinct interpretations, differing in the set of admissible fully-resolved phylogenies it encompasses. Consider the case of the polytomous node  $P$  in the MMC tree of Fig. 12. This node has three child subtrees  $S_1 = (\textit{Homo}, \textit{Hylobates})$ ,  $S_2 = (\textit{Pan}, (\textit{Cercopithecus}, \textit{Macaca}))$  and  $S_3$ , the Platyrrhini clade. The most widespread meaning of a soft polytomy accepts any fully-resolved tree on  $S_1, S_2, S_3$  that keeps them separated:  $((S_1, S_2), S_3)$ ,  $((S_1, S_3), S_2)$  or  $((S_2, S_3), S_1)$ . Strict consensus, majority-rule consensus, and hence MRP, interpret polytomies in this way (Margush and McMorris, 1981). Polytomies proposed by *PhySIC<sub>PC</sub>* are also to be interpreted in this way. A second interpretation of soft polytomies was introduced by the Adams

consensus (Adams, 1972) and is also intended by MC (Semple and Steel, 2000) and MMC (Page, 2002). This interpretation accepts as possible phylogeny any fully-resolved tree that maintains the structure of each subtree respectively, no matter whether or not  $S_1, S_2, S_3$  are kept separate (i.e. their leaves can be interleaved). Thus, the polytomy  $P$  of the MMC tree in Fig. 12 can indeed give rise to fully-resolved trees grouping *Pan* and *Homo* without *Hylobates*, as long as *Pan* is kept outside the clades containing *Cercopithecus* and *Macaca* (which is the structure imposed by  $S_2$ ). Under this interpretation, a soft polytomy represents a much wider range of fully-resolved phylogenies than with the first interpretation, and its meaning is thus harder to grasp. For instance, 315 possible fully-resolved phylogenies can be obtained under this interpretation of the polytomy on  $S_1, S_2, S_3$ , when considering  $S_3$  as a single taxa (this number increases markedly when replacing  $S_3$  with the four Platyrrhini taxa it represents). This explains why the first interpretation of soft polytomies prevails in phylogenetics. However, the point we make here is that a supertree cannot be interpreted without knowledge of the method that produced it. In particular, this means that simulation studies on supertree methods that use the Robinson and Foulds distance to evaluate the performance of MC or MMC are misleading: on the previous example, the MC method would have been considered to propose the incorrect clades (*Homo, Hylobates*) and (*Pan, Hylobates*), whereas all that can be said by the method in this case is that *Pan* nests outside the group containing *Cercopithecus* and *Macaca*.

The contribution of  $PhySIC_{PC}$  to the supertree inference may be illustrated by the situation among platyrrhines. Here, ADRA2B indicates that *Ateles* is the sister-group of *Pithecia, Callithrix*, and *Cebus*, whereas IRBP indicates that *Ateles* and *Cebus* are the closest relatives (Fig. 12: boxed areas). This conflict is detected by  $PhySIC_{PC}$ . As a result, the  $PhySIC_{PC}$  and  $PhySIC$  supertrees display all four platyrrhines within a multifurcation. By contrast, MRP and MMC give priority to the *Callithrix + Cebus* grouping present in the ADRA2B source tree, and thus con-

tradicts the *Ateles* + *Cebus* grouping present in the IRBP source tree. Resolution of this conflict between the source trees reflects the voting approach followed by MRP and MMC. For instance, consider the case of MRP: the ADRA2B source topology comprises two nodes within platyrrhines, against one for the IRBP topology. Therefore, MRP favors the node *Callithrix* + *Cebus* involved in a topological conflict but belonging to a larger and more resolved clade (Bininda-Emonds and Bryant, 1998). The behavior of MRP and MMC on platyrrhines is problematic. Indeed, it favors one source topology while contradicting another, just on the basis of their respective levels of resolution, and despite the fact that both contain the same number of taxa for the Platyrrhine subtree. Note also that source trees also conflict on the position of *Propithecus* with respect to *Microcebus* and *Lemur*. However, in this case, MRP behaves as *PhySIC<sub>PC</sub>* and *PhySIC*, i.e. displays a polytomy on groups containing these three taxa (Fig. 12: letters *a-b-c*). By contrast, MMC groups together the *Propithecus* and *Lemur* clades, following the SINE information, but contradicts the IRBP information.

The complementary contribution of *PhySIC<sub>PI</sub>* to the supertree inference may be illustrated by the situation among Catarrhines + Platyrrhines. Although not contradicting the source trees, the *PhySIC<sub>PC</sub>* supertree contains two topological errors. First, man and chimp do not group together relative to the gibbon, as would be expected from a plethora of data (Goodman et al., 2005). *Homo* is instead associated with *Hylobates*, whereas *Pan* branches with the two cercopithecoids, *Cercopithecus* and *Macaca*. This situation results from the taxon sampling of the source topologies. More precisely, man and chimp are not simultaneously present in any source tree, i.e. the former clusters with the gibbon (IRBP) and the latter with cercopithecoids (ADRA2B). These two source clades are reproduced in *PhySIC<sub>PC</sub>* and MMC supertrees.

In the case of *PhySIC<sub>PC</sub>*, these two clades are involved in a polytomy with the platyrrhines. This (separated soft) polytomy means that (*Homo*, *Hylobates*) is a sister clade of the clade con-



taining *Pan*. However, although these clades are correct when considered separately, they cannot be included as sister groups in the supertree. *PhySIC<sub>PI</sub>* detects this situation of arbitrary resolution and collapses the corresponding branches, thus the final *PhySIC* supertree allows for a group (*Pan*, *Homo*). MMC displays the same polytomy as *PhySIC<sub>PC</sub>* but with a different meaning: the interleaving interpretation of this soft polytomy means that MMC does not reject the expected resolution, namely grouping (*Pan*, *Homo*) as a sister clade of *Hylobates*. In conclusion, both MMC and *PhySIC* allows for the expected group (*Pan*, *Homo*), but note that the *PhySIC* supertree is more precise, as its polytomy does not allow *Homo*, *Hylobates* or *Pan*, to branch within the platyrrhines (as expected). Note that, in this case, MRP does not introduce arbitrary resolutions and proposes a polytomy involving the 5 catarrhine taxa. However, this is not the case in general and it has been strongly criticized on this point (e.g. Goloboff, 2005).

Another problem of MMC and *PhySIC<sub>PC</sub>* supertrees is that *Lepilemur* is the sister-group of all Lemuriformes but *Daubentonia*, whereas this topological information is not present in the only source tree (SINEs) for which *Lepilemur* is scored. This result is explained by the fact that the restriction of IRBP and ADRA2B source topologies to taxa lettered *a-b-c-x* leads to the situation described on Fig. 6. Thanks to the PI property, the *PhySIC* algorithm again corrects this problem, and displays a polytomy involving the major clades of lemuriformes, together with *Lepilemur* (Fig. 12). The same polytomy is also proposed by MRP. Overall, this case study illustrates that the two properties introduced in the present work help to identify and manage the potential arbitrary and conflicting resolutions arising in supertrees when combining independent source topologies.

# A biological application on Primate genera

## Primary data and source tree inference

We used 24 datasets to reconstruct the primate phylogeny: two mitochondrial DNA (mtDNA), 19 nuclear DNA (nuDNA), and three transposable elements datasets. All sequences used in this study were retrieved from EMBL-Genbank databases. The sampling of genes and other molecular markers is detailed in Table 1. This combined dataset encompasses 95% of all primate extant genera (Wilson and Reeder, 2005), i.e. 66 genera. Two subfossil genera from ancient DNA analyses were also included (Karanth et al., 2005). All genes were aligned with Clustal X (Thompson et al., 1997) with subsequent manual refinement. We used *Mus* and *Rattus* as outgroups in all analyses for which sequence data was available.

For each gene, we first selected the best fitting model under the ML criterion with Modeltest (Table 1). Separated maximum likelihood phylogenetic reconstructions and bootstrap analyses were performed with PHYML (Guindon and Gascuel, 2003) as described in previous section. Maximum parsimony phylogenetic reconstruction and bootstrap analysis on the three transposable element datasets were also conducted using PAUP\* (Swofford, 1998) as described in previous section. Clades of the source trees with BP values above a specified threshold were retained. To evaluate the influence of this parameter, five *PhySIC* supertrees were inferred by respectively considering  $BP \geq 50\%$ ,  $60\%$ ,  $70\%$ ,  $80\%$ , and  $90\%$ . Each run of *PhySIC* took less than 4 seconds on an Intel MacBook.

## The *PhySIC* supertree of Primate genera

The most resolved supertree reconstructed by *PhySIC<sub>PC</sub>* is obtained when source trees were restricted to nodes supported by more than 70% bootstrap (Fig. 13,  $BP \geq 70\%$ ). This

topology conforms to current ideas on Primate phylogeny, and is close to the informal supertree of Primates at the genus level proposed by Goodman et al. (2005). In addition, we here extended their taxon sampling with the three extant genera *Euoticus*, *Ptilocolobus*, and *Simias*, and the two subfossil genera *Megaladapis* and *Paleopropithecus*. Our supertree displays a fundamental dichotomy in Primates, between Strepsirrhini and Haplorrhini. Strepsirrhines then split into Lorisiformes (*Lorises* and *Galagos*) and Lemuriformes (*lemurs* and *Daubentonia*, the aye-aye). Haplorrhines also split into Tarsiers and Anthropoids. The latter clade subsequently divides into monophyletic New World primates (Platyrrhini) and Old World primates (Catarrhini). Platyrrhini display a trifurcation involving the three families Atelidae (the *Ateles* + *Alouatta* clade), Pitheciidae (the *Pithecia* + *Callicebus* clade), and Cebidae (the *Cebus* + *Saimiri* + *Aotus* + *Saguinus* clade). Catarrhines split into Hominoidea (gibbons and apes) and Cercopithecoidea (colobines and cercopithecines).

Since veto methods are used for evaluating the topological congruence of source trees, and for measuring their degree of overlap, the *PhySIC* program outputs labels on each polytomous node. A “C” label indicates that the polytomy results from topological contradictions among the source trees about phylogenetic relationships of the corresponding taxa: proposing a resolution for the polytomy would contradict at least one source tree, i.e. would not respect the PC property. An “I” label indicates a lack of cross-information in the source trees: any dichotomous resolution of the clade would be at least partially arbitrary, thus would not respect the PI property. Note that a given label applies only to the node to which it is assigned but not to other nodes in its subtrees. For instance, in the primate’s genera supertree, the platyrrhine trifurcation (Atelidae, Pitheciidae, Cebidae) with a C label indicates that there is topological contradiction among the source trees about the sister-group relationships of these three families. However, the C label does not put the monophyly of Atelidae, Pitheciidae, and Cebidae into question. Note also that a same polytomy

can be characterized by both C and I labels. This means that the inability of the supertree to propose a dichotomous resolution is partly due to a lack of taxonomic overlap, and partly due to contradictions. For example, Fig. 13 shows that the clade *Cercopithecus*, *Erythrocebus*, *Chlorocebus*, and *Miopithecus* is tagged by both C and I, reflecting two problems. On the one hand, source topologies disagree about the placement of *Erythrocebus*: this genus is either related to *Cercopithecus* (as suggested by IRBP exon 1) or to *Chlorocebus* (*cf.* the TSPY and chromosome Xq13.3 markers, and the Alu of Xing et al. (2005)). On the other hand, the input trees analyzed here do not provide the information required to know whether *Miopithecus* is the sister group of *Cercopithecus*, or is that of *Erythrocebus* + *Chlorocebus*, or is the most basal genus in the clade.

The number of clades retained from the original source trees depends on the bootstrap threshold required to select them for the supertree inference. Choosing a low threshold thus increases the number of retained source clades, hence lowers the number of polytomies due to a lack of cross-information among source trees, but increases the number of polytomies due to conflicts among source trees. Increasing the threshold has an opposite effect. The primate supertree of Fig. 13 was obtained with  $BP \geq 70\%$ . Lowering the threshold to  $BP \geq 50\%$  or  $BP \geq 60\%$ , *PhySIC* yields a completely multifurcating supertree, due to weakly supported but remanent phylogenetic conflicts among source trees. When the bootstrap stringency is increased from the  $BP \geq 70\%$  to  $BP \geq 80\%$  threshold, a similar level of resolution in the genus level phylogeny is obtained with the exception of two additional polytomies: the first involves Indriidae (*Indri* + *Avahi* + *Propithecus* + *Paleopropithecus*) relative to other lemuriformes, and the second involves *Allenopithecus* relative to the *Cercopithecus* clade (white stars in Fig. 13 refer to disappearing branches). Interestingly, changes of threshold removes a topological conflict among *Lophocebus*, *Papio* and *Theropithecus*: with the PC property being satisfied, then the *PhySIC* supertree groups together the latter two genera. At the  $BP \geq 90\%$  threshold, 7 additional polytomies with respect to the  $BP \geq 70\%$

topology appear (Fig. 13: black stars refer to node collapsing). This reflects the fact that among the population of source nodes (i.e. the nodes of source trees) less nodes with higher support are available for the supertree inference. The PI property is thus less often satisfied, leading to a greater number of irresolutions.

## Discussion

In this paper, we considered properties that supertree methods having a veto philosophy should honor. Based on the topological description of trees in terms of triplets, we introduced two desirable properties: i) the *induction property* (PI), requiring that triplets of the supertree be present in the source trees, or induced by triplets of the source trees; ii) the *non-contradiction property* (PC), requiring that triplets of the supertree do not contradict corresponding triplets of the source trees.

We described simple and polynomial-time algorithms that enable the user to check whether or not a given supertree satisfies these properties. We explained how any supertree can easily be modified by collapsing some of its edges to obtain a new supertree satisfying PI and PC. Finding a supertree that satisfies these properties and contains as much topological information as possible is a hard problem. To tackle this problem, we proposed a polynomial-time heuristic method called *PhySIC*. This heuristic is freely available as a web service at <http://atgc.lirmm.fr/cgi-bin/PhySIC/physic.cgi> and as a standalone program written in C++ using the Bio++ library (Dutheil et al., 2006).

Two reasons can lead the *PhySIC* method to propose a poorly resolved supertree. First, it is possible that the source trees contain too little cross information for the method to decide how the taxa of the respective source trees branch relatively to each other. In this case, all methods,

including voting methods, will produce unresolved supertrees. Obtaining more resolved supertrees can then only be achieved by adding new source trees containing new clades on the key taxa. The second reason why the *PhySIC* supertree can lack resolution is the presence of topological conflicts among source trees. Like other veto methods, *PhySIC* is very sensitive to incongruences in the source trees. Thus, to obtain a well-resolved tree, a preliminary process whereby unreliable clades are collapsed in the source trees is usually necessary before applying the method. This collapsing can be done on the basis of the support values provided on the clades by most phylogenetic inference methods (e.g. bootstrap values, bayesian posterior probabilities, Bremer support). We showed that a well-resolved supertree of Primates can be obtained with such an approach from a non-trivial number of gene trees. Note that on some datasets, contradicting clades showing high support values can occur, e.g. due to gene transfers. In such cases, veto methods will still produce unresolved supertrees (as long as they are not allowed to exclude rogue taxa). This can be seen as a drawback or as a way to pinpoint such events. In such cases, outlier source trees can then be identified (Shimodaira and Hasegawa, 1999; Lerat et al., 2003) and removed from the collection of source trees, leading to a more resolved supertree. Note that the *PhySIC* program outputs labels on each polytomous node of the supertree, which helps to identify the reason for the observed polytomies (lack of cross-information or presence of contradictions).

Veto supertree methods are of interest for combining source topologies containing reliable clades. Their study also brings insight for the characterization of what we expect from voting methods. Indeed, when source trees are not conflicting, there is no fundamental difference between the two approaches. In such cases, veto and voting approaches should lead to *reasonable* supertrees. What *reasonable* means can be characterized by several formal properties. In the present work, we showed pitfalls of some previously proposed supertree properties, and also proposed new properties. In the general case of conflicting source trees, we believe there is still room for improvement, *e.g.*

detecting arbitrary clades of a supertree even when it partially conflicts with some source trees, as usually happens in the voting context. With the new theoretical material at hand we believe that this is a reasonable goal.

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# Appendix

## Proof of Proposition 1

*Proof.* The proof is based on the fact that a set  $\mathcal{R}$  identifies a tree  $T$  if and only if  $rt(T) = cl(\mathcal{R})$  (Grunewald et al., 2006, Lem. 2.1).

$\Rightarrow$  By definition,  $\mathcal{R}(T, \mathcal{T})$  only contains triplets on 3-taxon sets for which there is a resolution in  $T$ . Moreover, PC ensures that any such triplet cannot be resolved in  $\mathcal{R}(T, \mathcal{T})$  differently than that in  $T$ . It follows that  $\mathcal{R}(T, \mathcal{T}) \subseteq rt(T)$ .  $\mathcal{R}(T, \mathcal{T})$  is therefore compatible and  $cl(\mathcal{R}(T, \mathcal{T})) \subseteq cl(rt(T)) = rt(T)$ . Meanwhile, having proved that  $\mathcal{R}(T, \mathcal{T})$  is compatible, it is clear from PI that  $cl(\mathcal{R}(T, \mathcal{T})) \supseteq rt(T)$ .

$\Leftarrow$  Having  $\mathcal{R}(T, \mathcal{T})$  identifying  $T$  ensures that  $\mathcal{R}(T, \mathcal{T})$  is compatible. On one hand,  $cl(\mathcal{R}(T, \mathcal{T})) = rt(T)$  implies that for all  $t \in rt(T)$ ,  $t \in cl(\mathcal{R}(T, \mathcal{T}))$ , i.e.  $\mathcal{R}(T, \mathcal{T}) \vdash t$  and therefore PI holds. On the other hand, given  $t \in rt(T)$ , if  $\mathcal{R}(T, \mathcal{T}) \vdash \bar{t}$  then, by definition of the closure,

$\bar{t} \in cl(\mathcal{R}(T, \mathcal{T})) = rt(T)$  so that both  $t$  and  $\bar{t}$  are in  $rt(T)$ , which is not possible. This proves that  $\mathcal{R}(T, \mathcal{T}) \not\models \bar{t}$  for any  $t \in rt(T)$ , i.e. PC holds.

□

### Proof of Proposition 3

*Proof.* Let  $AB|C \in rt(T)$  be a triplet of the output supertree  $T$  and consider the recursive step where the tree returned in line 3 hosts  $A, B$  in the same subtree  $T_i$ , while  $C$  is in another subtree, say  $T_j$ . This means that  $A, B$  are vertices in a connected component  $C_i$  of the current Aho graph  $G$ , while  $C$  is in another component  $C_j$  of  $CC(G)$ . If  $\mathcal{R}$  contained  $AC|B$  or  $BC|A$ , then  $C_i$  and  $C_j$  would not have been distinct connected components (in such cases, graph  $G$  would have contained the edge  $(A, C)$  or  $(B, C)$ ). Thus, for any triplet  $t$  of  $rt(T)$ , we know that no triplet  $\bar{t}$  is in  $\mathcal{R}$ , i.e.  $T$  does not directly contradict  $\mathcal{R}$ . This ensures that  $Build_{PC}$  returns a tree satisfying PC (lem. 1).

□

### Proof of Theorem 1

*Proof. Correctness of the algorithm:* The triplets present in the tree  $T_{PC}$  returned by  $PhySIC_{PC}$  depend on the internal branches of this tree. Any internal branch of  $T_{PC}$  is created at line 10 during some recursive step, thus linking a subtree  $T_i$  to the root of the tree returned by this step. Thanks to Lem. 1, we just have to prove that every branch created at this line does not generate a triplet that directly contradicts  $\mathcal{R}$ .

At this line, either (i)  $\mathcal{C}_{PC}$  corresponds exactly to the connected components of  $G$  (we have

$|CC(G)| > 1$ ) and then, from Prop. 3, the triplets created are not in direct contradiction with  $\mathcal{R}$ ; or (ii)  $\mathcal{C}_{PC}$  corresponds to a partition of the vertices of  $G$  based on  $\mathcal{R}'$ . Two cases are then possible. In the first case (line 4),  $G'$  is connected and the current call returns a multifurcation that generates no triplet and hence does not invalidate PC. In the second case, the **Repeat** loop ensures that for each set of three taxa  $A, B, C \in v(G)$ ,  $\mathcal{C}_{PC}$  does not contain two elements  $C_i$  and  $C_j$  with  $A, B \in C_i$  and  $C \in C_j$  such that either  $AC|B$  or  $BC|A$  belongs to  $\mathcal{R} = \mathcal{R}' \cup \mathcal{R}_{dc}$ . Indeed,  $AC|B$  (and  $BC|A$ ) cannot be in  $\mathcal{R}_{dc}$  since  $C_i$  would have been removed from  $\mathcal{C}_{PC}$  (line 9). Moreover, if  $AC|B$  (resp.  $BC|A$ ) was in  $\mathcal{R}'$ , then  $A$  and  $C$  (resp.  $B$  and  $C$ ) would have been in the same component of  $\mathcal{C}_{PC}$  contradicting  $C_i \neq C_j$ . This proves that the tree  $T_{PC}$  built in line 10, and whose subtrees bijectively correspond to the elements of  $\mathcal{C}_{PC}$ , is such that no triplet of  $rt(T_{PC})$  directly contradicts  $\mathcal{R}$ .

*Time complexity of the algorithm.* The most time consuming operations in  $PhySIC_{PC}$  are the computation of  $\mathcal{R}'|v(C_i)$  and  $G'_i$  (line 8), and that of the connected components of this graph (line 9). Obtaining  $\mathcal{R}'|v(C_i)$  and constructing  $G'_i$  requires considering each triplet of  $\mathcal{R}$  at most once and thus has a time complexity of  $O(n^3)$ . Determining the  $CC(G'_i)$ s costs  $O(n^2)$  (which is the maximum number of edges for a graph with  $n$  vertices). During the whole set of recursive calls to  $PhySIC_{PC}$ ,  $\mathcal{C}_{PC}$  is modified at most  $O(n)$  times (proportional to the number of clades of a tree with  $n$  leaves). Lines 8 and 9 are executed as many times as  $\mathcal{C}_{PC}$  is modified, i.e.  $O(n)$  times. Thus, for the whole set of recursive calls to  $PhySIC_{PC}$ , the computation time required by these critical lines is  $O(n^4)$ , which is also the complexity of the entire procedure.  $\square$



## Proof of Theorem 2

*Proof. Correctness of the algorithm:* we first prove that  $PhySIC_{PI}$  always returns a tree, denoted by  $T_{PI}$ , and then that  $T_{PI}$  satisfies both PC and PI. By hypothesis,  $PhySIC_{PI}$  is called with a tree  $T_{PC}$  that satisfies PC. Since  $PhySIC_{PI}$  modifies this tree by only collapsing some of its branches (possibly none), the tree considered in any execution  $Check_{PI}$  never directly contradicts  $\mathcal{T}$ . This ensures that the  $Check_{PI}$  subroutine never exits in line 12, i.e.  $PhySIC_{PI}$  always returns a tree. Moreover, being a contraction of  $T_{PC}$ , this tree satisfies PC.

$Check_{PI}$  differs from the *Identifies* algorithm in that `Return "tree not identified"` in the latter is replaced by line 14 in the former. Given a tree  $T$  and a set  $\mathcal{R}$  of triplets,  $Identifies(T, \mathcal{R})$  returns `yes` iff  $\mathcal{R}$  identifies  $T$  (otherwise it returns `no`) (Daniel, 2004, Thm. 3.1.1). This ensures that when a call to  $Check_{PI}(T, \mathcal{R}_{PI})$  issued by  $PhySIC_{PI}$  in line 11 collapses no branch of  $T_{PI}$ , then the set  $\mathcal{R}_{PI}$  identifies this tree. Since the tree  $T_{PI}$  returned by  $PhySIC_{PI}$  is such that it is not modified by the last run of  $Check_{PI}$ , then  $T_{PI}$  is identified by  $\mathcal{R}(T_{PI}, \mathcal{T}) = \mathcal{R}_{PI}$ . In other words,  $T_{PI}$  satisfies both PI and PC for  $\mathcal{T}$  (Prop. 1).

*Time complexity of the algorithm.* As for  $PhySIC_{PC}$ , the most time consuming operations done by  $PhySIC_{PI}$  are the construction of the Aho graph  $G_{ij}$  and the computation of its connected components in the  $Check_{PI}$  subroutine. The  $G_i$  graphs that may be used in  $Check_{PI}$  can be precomputed in the  $PhySIC_{PI}$  part of the pseudo-code (i.e. before calling  $Check_{PI}$ ), knowing  $rt(\mathcal{T})$  and the current tree  $T_{PI}$  to be examined in  $Check_{PI}$ . This preprocess clearly requires  $O(n^4)$  time, since there are  $O(n)$  such graphs (one for each clade of  $T$ ), each of which is obtained by examining the  $O(n^3)$  triplets of  $\mathcal{R}(T_{PI}, \mathcal{T})$ . Each  $G_{ij}$  graph can be obtained from a copy of the corresponding  $G_i$  graph, completed by the edges due to triplets  $ab|c$  having  $a, b \in C_i$  and  $c \in C_j$ .

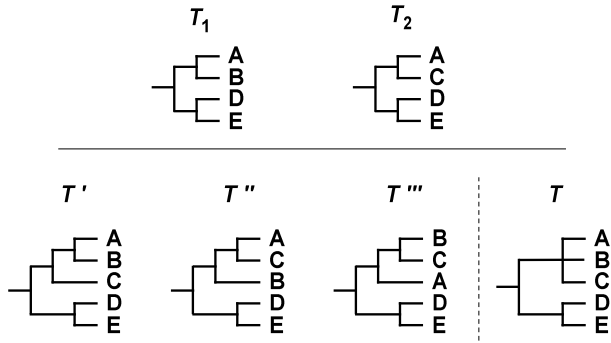
All the  $G_{ij}$  graphs required during the recursive calls to  $Check_{PI}$  resulting from an execution of line 11 in  $PhySIC_{PI}$  can also be precomputed in the  $PhySIC_{PI}$  pseudo-code part. This can be done just before line 11, provided that  $Check_{PI}$  is modified to end as soon as an edge is collapsed (line 14) – it is clear that this slight modification does not modify the correctness of the algorithm. Indeed, the only  $G_{ij}$ s that are then required by  $Check_{PI}$  are those corresponding to two sibling clades  $C_i$  and  $C_j$  of the current  $T_{PI}$  tree. Computing all of these  $G_{ij}$ s before line 11 of  $PhySIC_{PI}$  is done in  $O(n^3)$  since each triplet  $ab|c$  of  $rt(T_{PI})$  adds an edge between  $A$  and  $B$  in the one and only graph  $G_{ij}$ , such that  $C_i$  and  $C_j$  are sibling clades in  $T_{PI}$  and  $A, B \in C_i$  and  $C \in C_j$ .

Note also that the only information used by  $Check_{PI}$  on graph  $G_i$  and  $G_{ij}$  is the number of their connected components. The total number of edges present in the  $G_{ij}$  graphs is in  $O(n^3)$ : precomputation of the number of connected components for this set of graphs is thus globally  $O(n^3)$  time. As this has to be done at each pass of the **Repeat** loop, and as this loop is done at most  $O(n)$  times (each pass results in the collapsing of one of the  $O(n)$  clades of  $T$ ), this part of the computation is globally (on the whole for  $PhySIC_{PI}$ ) in  $O(n^4)$  time. Determination of the number of connected components of each  $G_i$  is done only once just before the **Repeat** loop. For each of these  $O(n)$  graphs, this requires examining  $O(n^3)$  triplets. Thus, this preprocess also costs  $O(n^4)$  time. The preprocesses done for  $G_i$  and  $G_{ij}$  graphs thus requires  $O(n^4)$  time and reduces the running time of  $Check_{PI}$ . The modification of  $Check_{PI}$ , consisting of returning to  $PhySIC_{PI}$  as soon as an edge is collapsed, also simplifies the algorithm (e.g. the **Repeat** loop is no longer required).

Thanks to the preprocessing, the only time-consuming operation in  $Check_{PI}$  for the current tree  $T_{PI}$  is the examination of the  $O(n^2)$  pairs of sibling clades  $C_i$  and  $C_j$  of this tree. Operations performed for each of this pair of clades is in  $O(1)$  (the number of connected components of useful graphs  $G$ ,  $G_i$  and  $G_{ij}$  have been preprocessed). Since a new tree  $T_{PI}$  can only be obtained by

collapsing one of the  $O(n)$  edges (line 14) of  $T_{PI}$ , this can at most occur  $O(n)$  times. Therefore, all executions of  $Check_{PI}$  issued by a run of  $PhySIC_{PI}$  are in  $O(n^3)$  time. Thus, the whole complexity of the  $PhySIC_{PI}$  algorithm is no more than the cost of the preprocessing, i.e.  $O(n^4)$  time.

□



**Figure 1: Supertrees can contain arbitrary resolution.**

Example of a collection  $\mathcal{T} = \{T_1, T_2\}$  of two source trees and several possible supertrees  $T'$ ,  $T''$ ,  $T'''$  and  $T$ . Unlike  $T$ , the supertrees  $T'$ ,  $T''$ ,  $T'''$  propose an arbitrary resolution for the clade  $A, B, C$ .

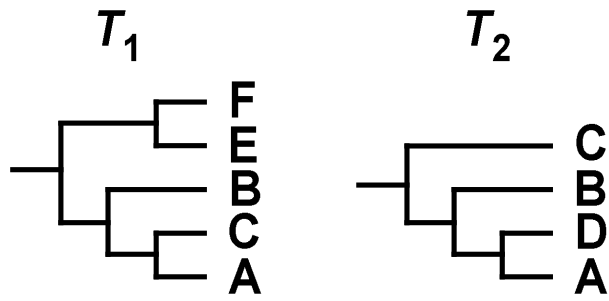
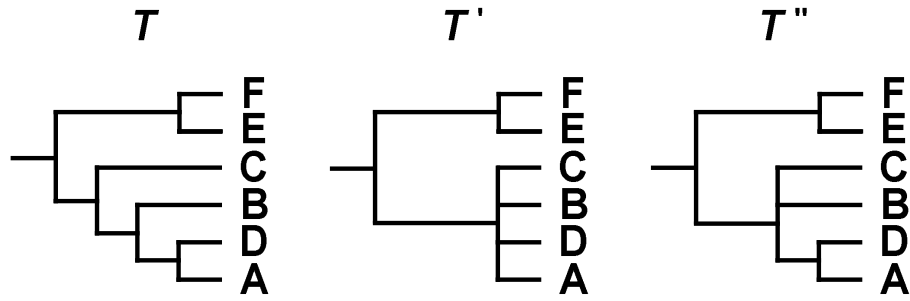


Figure 2: Example of a collection  $\mathcal{T} = \{T_1, T_2\}$  of two source trees.



**Figure 3: Various supertrees for the collection of Fig. 2.**

$T$  is the supertree proposed by the MC (Semple and Steel, 2000) and MMC methods (Page, 2002).  $T'$  and  $T''$  are the supertrees respectively proposed by the  $Build_{PC}$  and  $PhySIC_{PC}$  algorithms described in this paper.

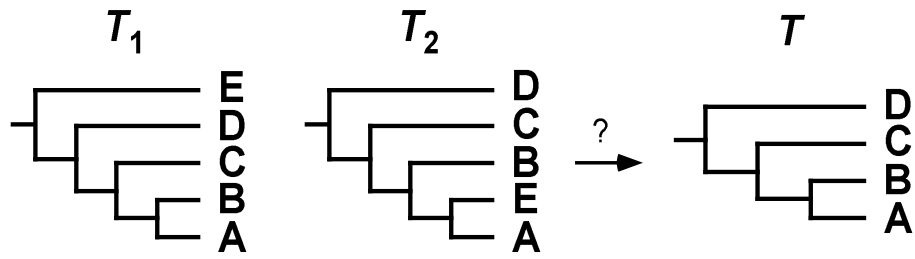


Figure 4: Excluding rogue taxa from the analysis can lead to informative supertrees.

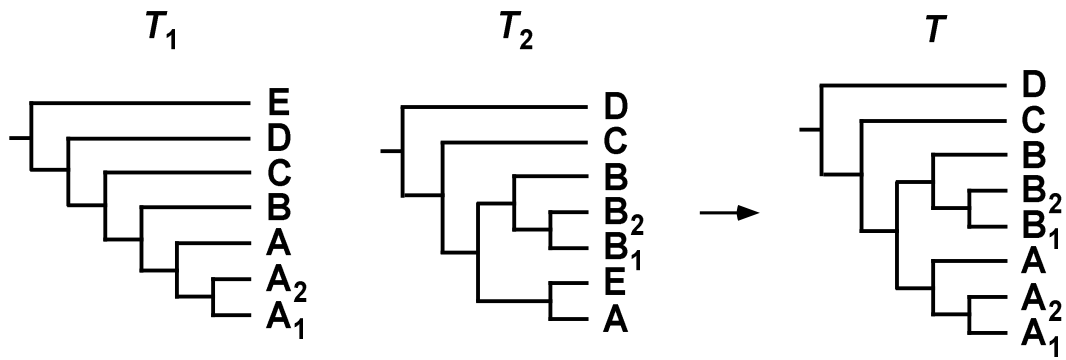
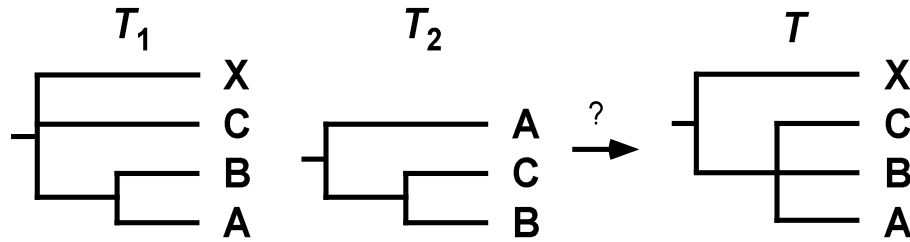


Figure 5: Another example with rogue taxa.

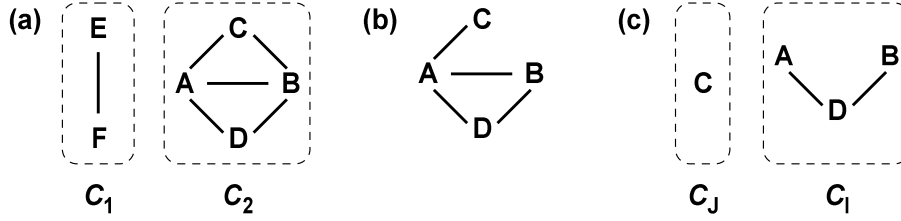
This figure presents a generalization of the example displayed in Fig. 4 to the case of a supertree containing more taxa than each input tree.





**Figure 6: Contradiction in the source trees can lead to arbitrary resolution.**

An example where the presence of contradiction in the source trees (namely,  $AB|C$  in  $T_1$  versus  $BC|A$  in  $T_2$ ) can lead to the inference of arbitrary clades (namely excluding  $X$  from the clade  $\{A, B, C\}$  in the supertree  $T$ ). This problem is detected by PI but not by PI' nor PC'.



**Figure 7: Examples of graphs.**

(a) The initial Aho graph  $G$  created from the triplets  $rt(\mathcal{T})$  of the collection  $\mathcal{T}$  displayed in Fig. 2. The two connected components of  $G$  are  $C_1 = \{E, F\}$  and  $C_2 = \{A, B, C, D\}$ . (b) the Aho graph obtained from  $\mathcal{R}|v(C_2)$ . This graph is connected, showing that the input trees conflict on the resolution of  $\{A, B, C, D\}$ , hence are incompatible. (c) the Aho graph obtained from  $\mathcal{R}|v(C_2)$  when removing the triplets  $\mathcal{R}_{dc} = \{AB|C, AC|B\}$ .



Algorithm  $PhySIC_{PC}(S, \mathcal{R})$

```

if  $S$  contains less than 3 taxa then return the trivial tree on  $S$ 
Let  $G$  denote the Aho graph for  $\mathcal{R}$ 
if  $G$  has several connected components then  $\mathcal{C}_{PC} \leftarrow CC(G)$ 
else
  Let  $\mathcal{R}_{dc}$  be the set of triplets  $t$  s.t.  $t, \bar{t} \in \mathcal{R}$ 
   $\mathcal{R}' \leftarrow \mathcal{R} - \mathcal{R}_{dc}$ 
  Let  $G'$  be the Aho graph for  $\mathcal{R}'$ 
4 if  $G'$  is connected then  $\mathcal{C}_{PC} \leftarrow v(G)$ 
  else
     $\mathcal{C}_{PC} \leftarrow CC(G')$ 
    5 repeat
    6   foreach  $AB|C \in \mathcal{R}_{dc}$  do
    7     if  $A, B \in C_i$  and  $C \in C_j$  (with  $C_i, C_j \in \mathcal{C}_{PC}$  and  $i \neq j$ ) then
    8       Build  $G'_i$  the Aho graph for  $\mathcal{R}'|v(C_i)$ 
    9       if  $G'_i$  is connected then  $\mathcal{C}_{PC} \leftarrow (\mathcal{C}_{PC} - \{C_i\}) \cup v(C_i)$ 
       else  $\mathcal{C}_{PC} \leftarrow (\mathcal{C}_{PC} - \{C_i\}) \cup CC(G'_i)$ 
    until  $\mathcal{C}_{PC}$  no longer changes
  foreach  $C_i \in \mathcal{C}_{PC}$  do
    if  $(\mathcal{R}|v(C_i)) = \emptyset$  then  $T_i \leftarrow$  star tree on  $v(C_i)$ 
    else  $T_i \leftarrow PhySIC_{PC}(v(C_i), \mathcal{R}|v(C_i))$ 
10 Return the tree made of a root node connected to  $T_1, T_2, \dots, T_{|\mathcal{C}_{PC}|}$ 

```

**Figure 9: Details of the  $PhySIC_{PC}$  subroutine taking a set  $S$  of taxa and a set  $\mathcal{R}$  of triplets on  $S$  as input.**

Algorithm  $PhySIC_{PI}(T, \mathcal{T})$

$T_{PI} \leftarrow T$   
**repeat**  
     $\mathcal{R}_{PI} \leftarrow \mathcal{R}(T_{PI}, \mathcal{T})$   
11     $T_{PI} \leftarrow Check_{PI}(T_{PI}, \mathcal{R}_{PI})$   
**until**  $T_{PI}$  no longer changes  
Return  $T_{PI}$

Algorithm  $PhySIC(\mathcal{T})$

Let  $S$  be the taxa appearing in  $\mathcal{T}$   
 $\mathcal{R} \leftarrow rt(\mathcal{T})$   
 $T_{PC} \leftarrow PhySIC_{PC}(S, \mathcal{R})$   
Return  $PhySIC_{PI}(T_{PC}, \mathcal{R})$

Algorithm  $Check_{PI}(T, \mathcal{R})$

**if**  $T$  is made of a single leaf **then** return  $T$   
Let  $G$  be the Aho graph for  $\mathcal{R}$   
12 **if**  $|CC(G)| = 1$  **then** return “error,  $\mathcal{R}$  is incompatible”  
13 **repeat**  
    **foreach**  $T_i \in S(T)$  **do**  
        Let  $G_i$  be the Aho graph for  $\mathcal{R}|L(T_i)$   
        **foreach**  $T_j \in S(T)$  s.t.  $T_i \neq T_j$  **do**  
            Build  $G_{ij}$  from  $G_i$  and  $\mathcal{R}|(L(T_i) \cup L(T_j))$   
            **if**  $G_{ij}$  is not connected **then**  
14             Collapse the branch between the root  
                    of  $T$  and  $T_i$   
**until** no branch of  $T$  is collapsed  
**foreach**  $T_i \in S(T)$  **do**  
     $T'_i \leftarrow Check_{PI}(T_i, \mathcal{R}|L(T_i))$   
Return the tree made of a root node connected to  
 $T'_1, T'_2, \dots, T'_{|S(T)|}$

Figure 10: Details of the  $PhySIC$  algorithm and  $PhySIC_{PI}$  and  $Check_{PI}$  subroutines.

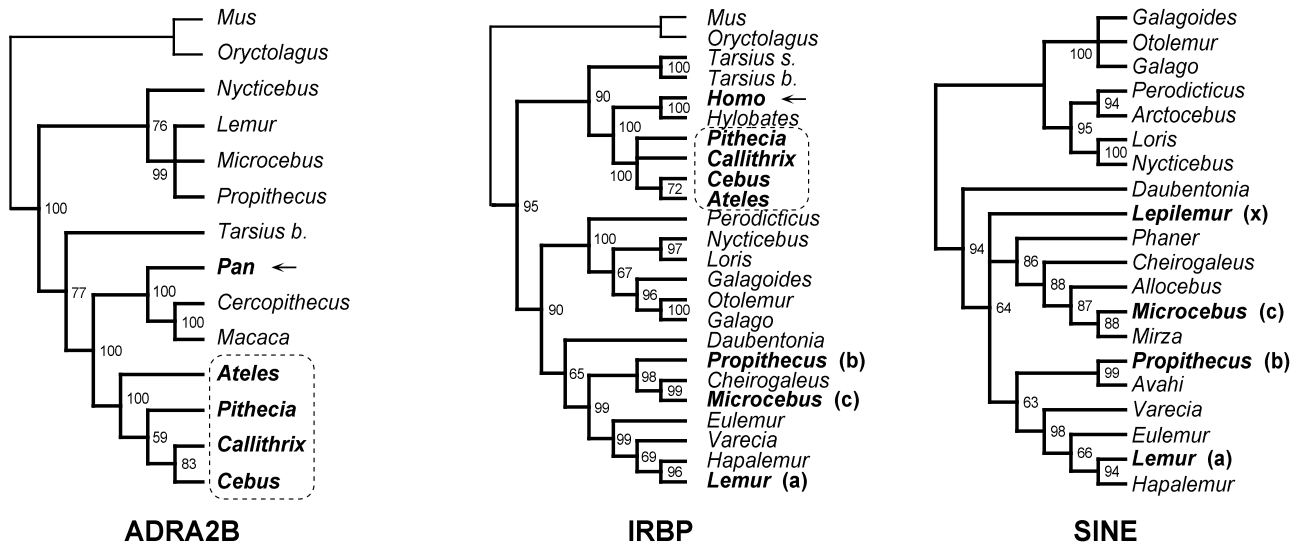


Figure 11: Three source trees for the case study on primates.

Majority rule consensus source trees derived from the bootstrap analysis of ADRA2B and IRBP sequences (in maximum likelihood), and SINE characters (in maximum parsimony). Bootstrap percentages are indicated on nodes, and only nodes defined by more than 50% are considered. Thin branches lead to the outgroup. Taxa in bold are handled differently by the different supertree algorithms and illustrate three different situations (arrows, letters, box: see main text). The two *Tarsius* species are *T. bancanus* (*B*) and *T. syrichta* (*S*).

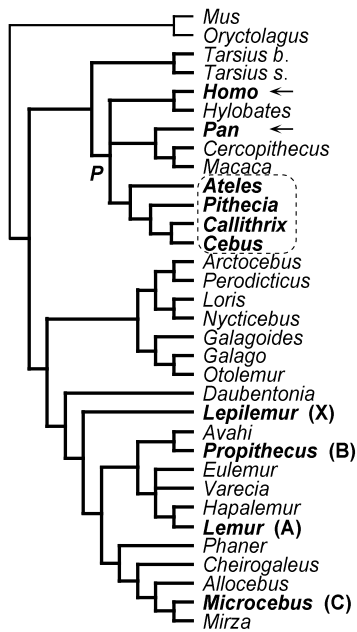
**Figure 12: Comparison of supertrees inferred by three methods: MMC, MRP and *PhySIC* (the *PhySIC<sub>PC</sub>* intermediate step of the latter is also displayed).**

Thin branches lead to the outgroup. Taxa in bold are handled differently by the different supertree algorithms and illustrate three different situations. (i) Arrows indicate the surprising positioning of *Homo* and *Pan* under the MMC and *PhySIC<sub>PC</sub>* algorithms ; (ii) A-B-C-X letters correspond to taxa arbitrarily grouped by MMC and *PhySIC<sub>PC</sub>* (*cf.* Fig. 2); (iii) boxes contain platyrrhine taxa for which MMC and MRP contradict the IRBP source topology. The *P* label on MMC and *PhySIC<sub>PC</sub>* supertrees refers to the polytomy involving catarrhine and platyrrhine clades. The taxonomic frame for Primates is given on the *PhySIC* supertree. Hatched rectangles represent Anthropoidea (Catarrhini + Platyrrhini). White and black rectangles respectively represent Haplorrhini (Tarsiiformes + Anthropoidea) and Strepsirrhini (Lorisiformes + Lemuriformes).

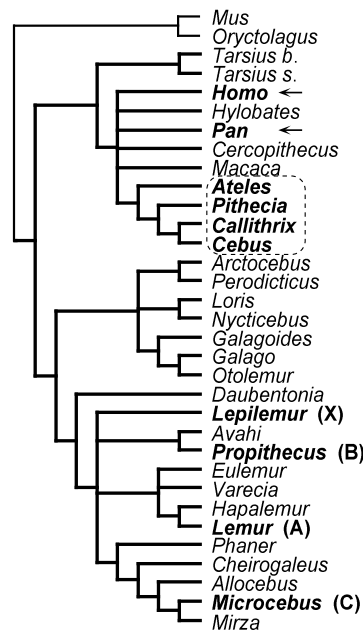
**Figure 13: Primate *PhySIC* supertree including 95% of all extant genera and containing no contradiction nor arbitrary resolution with respect to the source trees, as defined by the PI and PC properties.**

The genus-level primate supertree has been reconstructed from 24 molecular source trees restricted to nodes supported by more than 70% bootstrap. When the bootstrap threshold is increased to 80% – respectively 90% – the supertree topology changes: disappearing branches as well as one appearing clade (*Papio* + *Theropithecus*) are indicated by white – respectively black – stars. Polytomies are labelled by tags pointing out the properties (PI, PC, or both) that would not be satisfied if the corresponding clade was more resolved. The taxonomic frame and clade names for Primates are given. Hatched rectangles represent Anthropoidea (Platyrrhini + Catarrhini). White and black rectangles respectively represent Haplorrhini (Tarsiiformes + Anthropoidea) and Strepsirrhini (Lorisiformes + Lemuriformes).

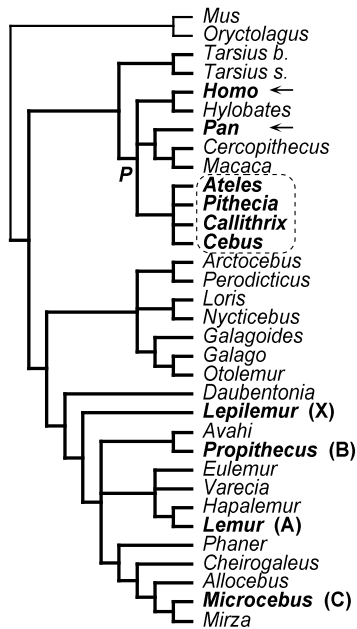




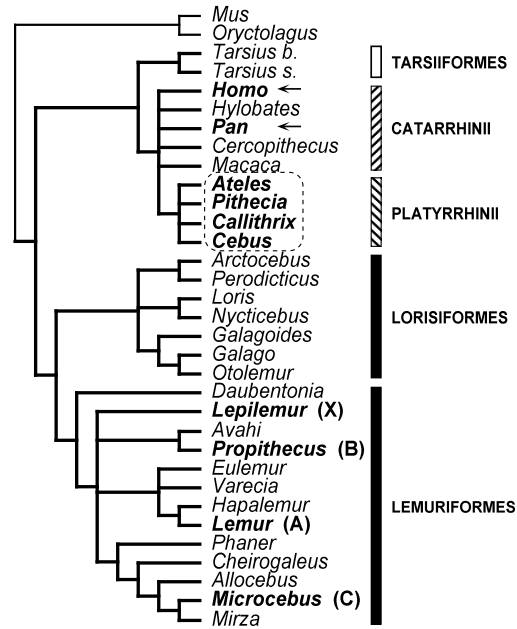
Modified MinCut (MMC)



Matrix Representation with Parsimony (MRP)



PhySIC<sub>PC</sub>



PhySIC

Figure 12: Comparison of supertrees inferred by three methods: MMC, MRP and *PhySIC* (the *PhySIC<sub>PC</sub>* intermediate step of the latter is also displayed).

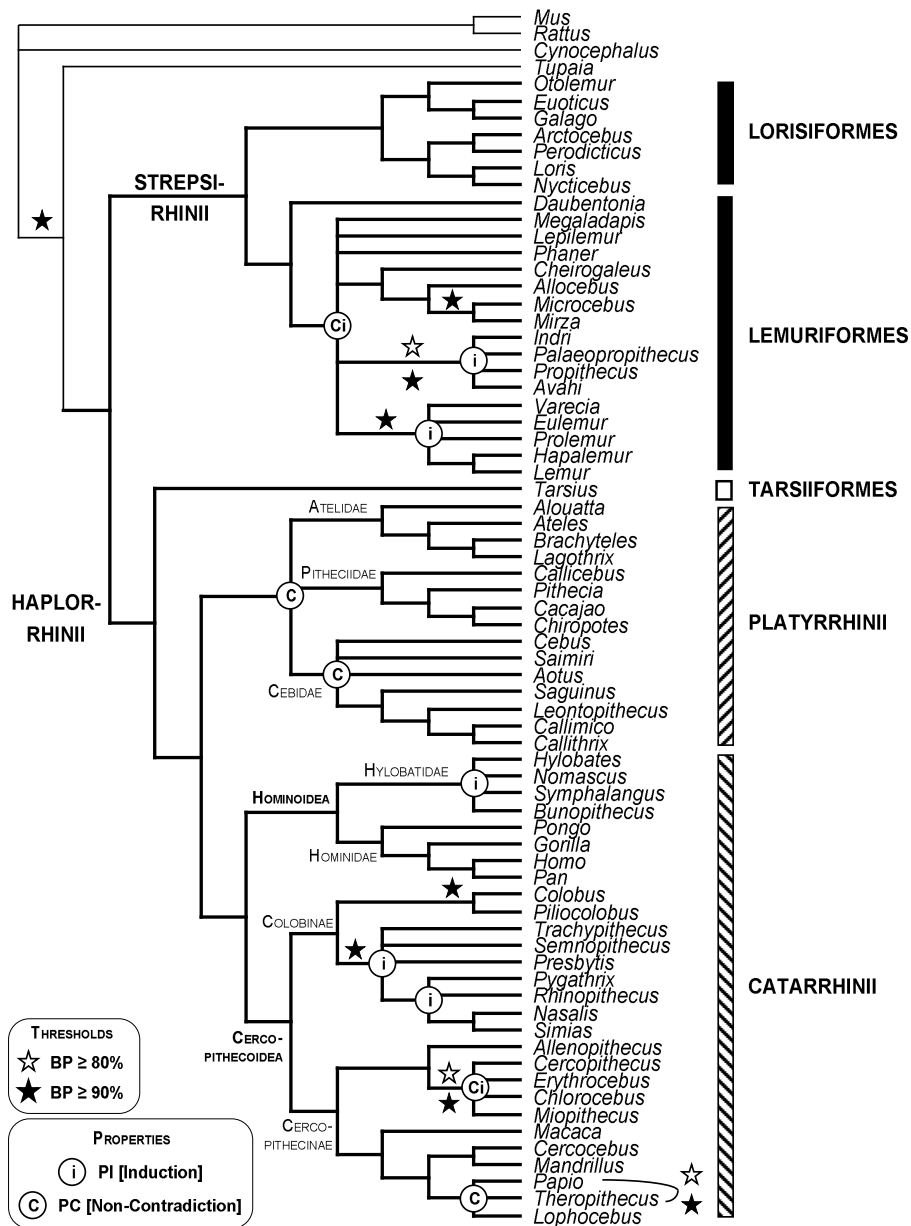


Figure 13: Primate *PhySIC* supertree including 95% of all extant genera and containing no contradiction nor arbitrary resolution with respect to the source trees, as defined by the PI and PC properties.

| MARKERS  | MODEL            | GENERA |
|--|------------------|--------|
| $\alpha$ -2B Adrenergic Receptor                     | HKY+ $\Gamma$    | 16     |
| Albumin gene introns 3 and 4                         | K80+I            | 20     |
| ATPase 7A  | HKY+ $\Gamma$    | 11     |
| Breast and Ovarian Cancer Susceptibility 1           | HKY+ $\Gamma$    | 12     |
| Cytochrome b [mtDNA]                                 | GTR+ $\Gamma$ +I | 68     |
| $\alpha$ -1,2 fucosyltransferase                     | HKY+ $\Gamma$    | 21     |
| $\beta$ globin                                       | GTR+I+ $\Gamma$  | 22     |
| $\gamma$ globin exons 1 and 2                        | HKY+ $\Gamma$    | 26     |
| $\epsilon$ globin                                    | HKY+ $\Gamma$    | 33     |
| Glucose-6-Phosphate Dehydrogenase introns 4 and 5    | HKY+ $\Gamma$    | 18     |
| Glucose-6-Phosphate Dehydrogenase introns 7 and 8    | HKY+ $\Gamma$    | 12     |
| Interphotoreceptor Retinoid Binding Protein exon 1   | HKY+ $\Gamma$    | 34     |
| Interphotoreceptor Retinoid Binding Protein intron 1 | K80+ $\Gamma$    | 24     |
| Lysozyme Gene  | HKY+ $\Gamma$    | 19     |
| Membrane Cofactor Protein gene                       | HKY+ $\Gamma$    | 13     |
| $\beta$ 2 microglobulin precursor exons 1 and 2      | HKY+ $\Gamma$    | 18     |
| NADH dehydrogenase subunit 5 [mtDNA]                 | GTR+ $\Gamma$ +I | 24     |
| Phospholipase C $\beta$ 4 gene                       | GTR              | 13     |
| Testis-Specific Protein Gene                         | HKY+ $\Gamma$    | 21     |
| von Willebrand gene introns 11 and 12                | HKY+ $\Gamma$    | 37     |
| 9.3 kb chromosome Xq13.3 fragment                    | HKY+ $\Gamma$    | 13     |
| SINE (Roos et al., 2004)                             | –                | 20     |
| ALU (Singer et al., 2003)                            | –                | 8      |
| SINE (Xing et al., 2005)                             | –                | 15     |

**Table 1: Molecular markers used to infer the primate source trees.**

The best-fitting model and the number of primate genera per marker are indicated. (mtDNA: mitochondrial DNA).