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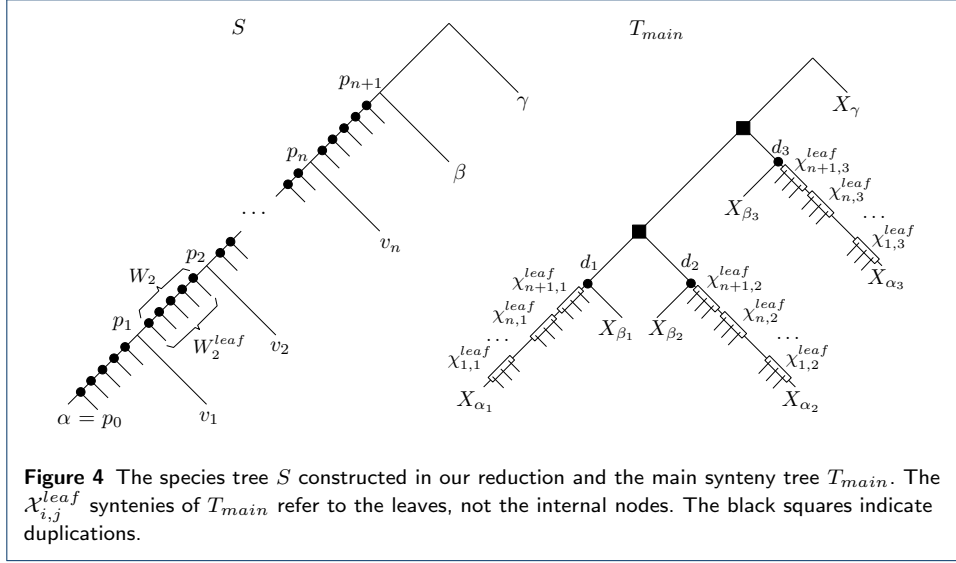
NP-hardness of the Super-Reconciliation problem

We show here that finding a super-reconciliation that minimizes the number of *Dup*, *fLoss* and *pLoss* events is NP-hard. We reduce the problem of CUBIC 3-EDGE-COLORING to SUPER-RECONCILIATION. Given a graph $G = (V, E)$ in which each vertex has exactly 3 neighbors, the cubic 3-edge-coloring problem asks whether there exists a *proper coloring* of E with 3 colors, i.e. a partition of E into 3 sets $\{E_1, E_2, E_3\}$ such that for any vertex $v \in V$, the three edges incident to v all belong to a different E_i set. Note that if such a coloring exists, $|E_1| = |E_2| = |E_3| = |E|/3$. This problem was shown to be NP-hard in [49].

In what follows, for an integer k we will denote $[k] = \{1, 2, \dots, k\}$. The father of a node v in a tree will be denoted $p(v)$ (p for ‘parent’). Let $G = (V, E)$ be an instance of CUBIC 3-EDGE-COLORING, and denote $V = \{v_1, \dots, v_n\}$. The ordering of the v_i vertices is not important but must remain fixed for the duration of the proof. To describe our corresponding SUPER-RECONCILIATION instance, we first define the species tree S , which is illustrated in Figure 4. Let S' be a caterpillar on leafset $V \cup \{\alpha, \beta, \gamma\}$ (here a caterpillar is a binary rooted tree in which each internal node has at least one child that is a leaf), where the leaves appear in the order $(\alpha, v_1, v_2, \dots, v_n, \beta, \gamma)$ when traversing from the deepest to the closest leaf to the root. The species α, β and γ are special species, and the $v_1, \dots, v_n$ species are those corresponding to V . For each $i \in [n]$, denote $p_i := p(v_i)$, and $p_0 := \alpha, p_{n+1} := p(\beta)$. To obtain S , for every $i \in [n+1]$, graft a large number of new leaves, say n^{10} , on the branch $p_{i-1}p_i$. Thus there are now n^{10} new internal nodes on the path between p_{i-1} to p_i , and we denote this set of n^{10} internal nodes as W_i , and the set of n^{10} newly inserted leaves as W_i^{leaf} (Figure 4 only shows 5 of the W_i and W_i^{leaf} nodes, with W_2 and W_2^{leaf} shown explicitly). Note that S is a caterpillar with $(n+1)n^{10} + n + 3$ leaves.

Now, denote $E' = \{(v_i, v_j), (v_j, v_i) : \{v_i, v_j\} \in E\}$, where we think of E' as the set of edges E , but where each edge appears in both directions. We define the set of syntenies (the content of these syntenies will be defined later — we are only listing them here)

$$\mathcal{X} = \{X_\gamma\} \cup \{X_{\alpha_i}, X_{\beta_i} : 1 \leq i \leq 3\} \cup \mathcal{X}_{E'} \cup \bigcup_{i \in [n+1]} \bigcup_{j \in [3]} \mathcal{X}_{i,j}^{leaf}$$



where $\mathcal{X}_{E'} = \{X_{ij} : (v_i, v_j) \in E'\}$ and for each $i \in [n+1], j \in [3]$, $\mathcal{X}_{i,j}^{leaf}$ is a set of n^{10} synteny trees that has exactly one synteny for each member of W_i^{leaf} . We put $s(X_{\alpha_i}) = \alpha, s(X_{\beta_i}) = \beta$ for each $1 \leq i \leq 3$, $s(X_\gamma) = \gamma$ and $s(X_{ij}) = v_i$ for each $(v_i, v_j) \in E'$. Hence the first subscript of a X_{ij} synteny indicates its species. Thus each species has 3 synteny trees, except γ which has one. Observe that $|\mathcal{X}_{E'}| = 3n$.

Instead of describing the set of input gene trees, we describe them as synteny trees directly. We thus omit the usual tilde symbol, e.g., we write T instead of $\tilde{T}$ with the understanding that T is a synteny tree whose corresponding gene tree has a unique gene at each of its leaves. There is one main synteny tree T_{main} , illustrated on Figure 4. To obtain it, for each $j \in [3]$, define a tree T_{main}^j as the unique synteny tree on leafset $\{X_{\alpha_j}, X_{\beta_j}\} \cup \bigcup_{i \in [n+1]} \mathcal{X}_{i,j}^{leaf}$ that has only speciations. Another way to view T_{main}^j is that it is obtained by taking a copy of S , by removing the $v_1, \dots, v_n$ species and relabeling the species at the leaves by the appropriate synteny trees for the index j . The tree T_{main} is then obtained by joining the T_{main}^j trees and X_γ as follows (using Newick notation):

$$T_{main} = (((T_{main}^1, T_{main}^2), T_{main}^3), X_\gamma)$$

Note that T_{main} has 2 duplication nodes. We will call d_1 and d_2 the two children of the lower duplication, and d_3 the other duplication child (see Figure 4). The rough idea behind our reduction is that T_{main} has 3 subtrees that each contain a synteny from each species, except $v_1, \dots, v_n$. These appear as losses in each T_{main}^j subtree. However, in $\mathcal{X}$ we have three synteny trees for each species $v_1, \dots, v_n$, just enough to “fill-up” these losses. The main goal in our construction is to make this complete “fill-up” of the losses possible if and only if G is 3-colorable by making each T_{main}^j subtree represents a color. We will build additional input trees to realize this idea. Our goal is to enforce that X_{ij} and X_{ji} can only fill-up the losses under the same subtree.

We have another synteny tree T'_{main} defined as:

$$T'_{main} = (((X_{\alpha_1}, X_{\alpha_2}), X_{\alpha_3}), X_\gamma)$$

Note that T'_{main} does not provide any new information on the structure of a supertree, but will play a role later in the gene ordering in the syntenies.

Then for each $v_i \in V$, let v_j, v_k, v_l be the neighbors of v_i and let

$$T_{ijk} = (((X_{ij}, X_{ji}), (X_{ik}, X_{ki})), X_\gamma)$$

$$T_{ijl} = (((X_{ij}, X_{ji}), (X_{il}, X_{li})), X_\gamma)$$

$$T_{ikl} = (((X_{ik}, X_{ki}), (X_{il}, X_{li})), X_\gamma)$$

For notational convenience, for all i, j, k we will say that $T_{ijk} = T_{ikj}$, i.e. both refer to the same tree. Note that for every edge $v_i v_j \in E$, X_{ij} occurs in exactly 4 trees (in 2 trees of the form T_{ijk} and 2 trees of the form T_{jik}). The set of synteny trees/families $\mathcal{G}$ contains T_{main}, T'_{main} and all the T_{ijk} trees.

It only remains to define the given gene orders for the extant syntenies $\mathcal{X}$. We will define these orders as strings on alphabet $\mathcal{G}$ directly. For $X \in \mathcal{X}$, let $t(X)$ be the set of synteny trees of $\mathcal{G}$ that X appears in. Observe that X_γ appears in every synteny tree, and thus there is only one possible ancestral sequence of gene families. In other words, the X_γ syntenies are a string Z over alphabet $\mathcal{G}$, and the order of every other syntenies X is the subsequence of Z for the characters $t(X)$. We let Z be any string that begins with T_{main} and ends with T'_{main} . This completes the construction of our SUPER-RECONCILIATION instance.

We show that G admits a proper 3-edge coloring if and only if our instance formed by $S, \mathcal{G}$ and order Z admits a Super-Reconciliation of total cost at most $3(n+1)n^{10} + 15n + 8$.

($\Rightarrow$) For the first direction, suppose that G admits a proper 3-edge coloring. Let E_1, E_2, E_3 be the underlying partition of the edges into 3 color classes. Let D_1, D_2 and D_3 be the subtrees of T_{main} rooted at d_1, d_2 and d_3 , respectively. Notice that for each $l \in [3]$, the set $\{s(X) : X \in \mathcal{L}(D_l)\}$ is equal to $\mathcal{L}(S) \setminus V$. We “fill-up” each D_l subtree with a leaf from a syntenies that belongs to v_j for every $v_j \in V$. More precisely, for each $l \in [3]$ and each $v_i \in V$, let $v_i v_j$ be the edge of E_l that is incident to v_i . We graft the corresponding syntenies X_{ij} (from species v_i) onto D_l on the branch that makes its parent a speciation (this location is unique). Call T the syntenies tree resulting from these graftings. In this manner, every D_l subtree has exactly one syntenies from every v_i species. Moreover, every syntenies gets grafted onto T , no new duplications are created and T has no full losses. It is not difficult to verify that the resulting tree displays all input trees (the T_{ijk} trees are displayed because two X_{ij} and X_{ji} syntenies will be grafted under the same D_l subtree, and this subtree is different from where X_{ik} and X_{ki} get inserted into, since $v_i v_j$ and $v_i v_k$ belong to a different E_l set).

Our tree T has 2 duplications and no full losses. To count partial losses, we assign the string Z to every internal node. Let X be any leaf of T that belongs to a species

in W_i^{leaf} for some $i \in \{1, \dots, n+1\}$. The X synteny only appears in T_{main} , so because Z starts with T_{main} , we may add a single partial loss on the branch from X to its parent. This amounts to $3(n+1)n^{10}$ segmental losses. The syntenies X_{α_i} and X_{β_i} can be handled similarly with a single loss on the branch to their parent. As $i \in \{1, 2, 3\}$, this amounts to 6 losses. The X_γ leaf does not incur any losses. As for a synteny $X_{ij} \in \mathcal{X}_{E'}$, recall that X_{ij} appears in at most 4 gene families. This can be handled by using at most 5 segmental losses on the path between X_{ij} and its parent. As $|\mathcal{X}_{E'}| = 3n$, this adds at most $15n$ losses. In total, we the total cost is $3(n+1)n^{10} + 15n + 8$, which is conveniently the number that we predicted.

($\Leftarrow$) For the converse direction, let T be a supertree for $\mathcal{G}$ on leafset $\mathcal{X}$ that yields a reconciliation of cost at most $3(n+1)n^{10} + 15n + 8$. We assume that each internal node is assigned a gene family sequence that is a subsequence of Z .

Note that since T is compatible with T_{main} , T can be seen as a tree obtained by starting with T_{main} , then grafting some subtrees $T_1, \dots, T_r$ successively onto some branches of T_{main} . To see this, let T' be the tree obtained from T by deleting every node that does not have a descendant in $\mathcal{L}(T_{main})$. Then T' is the same tree as T_{main} , but with some nodes of degree 2 denoted $t_1, \dots, t_r$ (excluding the root) that consist of the locations where the $T_1, \dots, T_r$ trees were grafted (note that the roots of T_{main} and T must be the same due to X_γ). For each $i \in [r]$, we will assume that the root of T_i was grafted onto T_{main} under t_i , i.e. $r(T_i)$ is a child of the node t_i . Note that $\{\mathcal{L}(T_1), \dots, \mathcal{L}(T_r)\}$ forms a partition of $\mathcal{X} \setminus \mathcal{L}(T_{main})$. Under the above view of T , we will think of a node x of T_{main} as also a node of T , whether x is internal or leaf.

We show how to obtain a proper edge coloring of G . The proof is divided into a series of claims, the first one showing that every leaf in a W_i^{leaf} must incur a segmental loss.

Claim 1 *Let $X \in \mathcal{X}_{i,j}^{leaf}$ be a synteny for which $s(X) \in W_i^{leaf}$ for some $i \in [n+1]$ and $j \in [3]$. Moreover let p_X be the parent of X in T_{main} . Then in T , there is either a duplication or a partial loss on the path from p_X to X .*

Proof Let Z_p be the gene family string assigned at p_X . Observe that in T , the p_X node has a descendant X_{α_i} for some $i \in [3]$. The family X_{α_i} appears in the trees T_{main} and T'_{main} , implying that both these families are in Z_p . Since X only appears in T_{main} , the T'_{main} character from Z_p must be lost on the path from p_X to X , either by a duplication or partial segmental loss. $\square$

As a consequence of Claim 1, there are at least $3(n+1)n^{10}$ duplications and/or partial segmental losses in T . Our strategy is the following: we will show that if the X_{ij} syntenies are not setup to “fill up” every hole in the d_1, d_2 and d_3 subtrees of T as in our solution for the converse direction, then there must be at least n^{10} full losses in T (as opposed to partial losses). As these were not counted in Claim 1, this would imply that T has $3(n+1)n^{10} + n^{10} > 3(n+1)n^{10} + 15n + 8$ losses, a contradiction. We next show that the trees that get grafted onto T_{main} to obtain T all consist of syntenies from a single species.

Claim 2 *Let $X_{ij} \in \mathcal{X}_{E'}$, and let T_h be the tree grafted onto T_{main} that contains X_{ij} . If T_h has another leaf $X_{kl} \in \mathcal{X}_{E'}$, then $k = i$.*

Proof Suppose instead that $k \neq i$. Then $v_i = s(X_{ij}) \neq s(X_{kl}) = v_k$. We then have $s(r(T_h)) \geq lca_S(v_i, v_k)$. Assume without loss of generality that $k > i$. Observe that T_h cannot contain any leaf with a species in W_{i+1}^{leaf} , because all syntenies with a species in W_{i+1}^{leaf} are already in T_{main} . However, the path from $s(r(T_h))$ to v_i in S contains the set of nodes W_{i+1} (because $k > i$), where $|W_{i+1}| = n^{10}$. By the definition of reconciliation, in any reconciliation, each node in W_{i+1} must have at least one corresponding node in T_h on the path between $r(T_h)$ and X_{ij} , all of which must have a child that is a full loss in a node in W_{i+1}^{leaf} . It follows that T has at least n^{10} additional losses, a contradiction. $\square$

Recall that T_{main} (and hence T) has two duplication nodes with children d_1, d_2 and d_3 . Ignoring X_γ , these three nodes partition the leaves of T_{main} into 3 subsets. These will correspond to our edge colors. Towards this goal, for a syntenies $X_{ij} \in \mathcal{X}_{E'}$, we will say that X_{ij} is of color 1 (respectively color 2 and 3) if it is a descendant of d_1 (respectively of d_2 and d_3). Note that X_{ij} has at most one color, but may have none - which we prove to not be the case.

Claim 3 *For each syntenies $X_{ij} \in \mathcal{X}_{E'}$, X_{ij} has a (unique) color.*

Proof Suppose otherwise that there is some X_{ij} that has no color. Let T_h be the subtree grafted onto T_{main} that contains X_{ij} , with t_h the parent of $r(T_h)$. Since X_{ij} has no color, it follows that t_h must be an ancestor of d_1, d_2, d_3 or X_γ (all or some of these cases can hold simultaneously). In all cases, we have $s(t_h) \geq lca_S(\alpha, \beta)$ in any reconciliation. Moreover by Claim 2, T_h has only leaves from the v_i species. It follows that on the path from t_h to X_{ij} , there is a loss for each node in W_{i+1} . Once again, this incurs n^{10} additional losses, a contradiction. $\square$

We then show that syntenies from the same species get distinct colors, owing to the T_{ijk} trees.

Claim 4 *Let $X_{ij}, X_{ik} \in \mathcal{X}_{E'}$ be two distinct syntenies from the same species v_i . Then X_{ij} and X_{ik} do not have the same color.*

Proof Suppose that X_{ij} and X_{ik} have color 1, without loss of generality. Let $T_{i'}, T_{j'}$ and $T_{k'}$ be the subtrees grafted onto T_{main} that contain X_{ij}, X_{ji} and X_{ik} , respectively (where $t_{i'}, t_{j'}, t_{k'}$ are the parents of $r(T_{i'}), r(T_{j'}), r(T_{k'})$, respectively). By Claim 2, we know that $T_{i'} \neq T_{j'} \neq T_{k'}$, although $T_{i'} = T_{k'}$ is possible. Recall that we have the tree $T_{ijk} = (((X_{ij}, X_{ji}), (X_{ik}, X_{ki})), X_\gamma)$ in the input. Since T displays T_{ijk} , this implies that $t_{k'}$ cannot be a descendant of $lca_T(t_{i'}, t_{j'})$, and therefore $T_{i'} \neq T_{k'}$. Also, because X_{ik} is of color 1, $t_{k'}$ must be a descendant of d_1 . Thus $t_{k'}$ is either (1) an ancestor of $lca_T(t_{i'}, t_{j'})$, or (2) $t_{k'}$ is on the path between a leaf $w \in \mathcal{X}_{l,1}^{leaf}$ and its parent $p(w)$ in T_{main} , where $l \in \{1, \dots, n+1\}$. In case (1), the only way that T can display T_{ijk} is if X_{ki} belongs to $T_{k'}$, along with X_{ik} .

This contradicts Claim 2. In case (2), let $T_{k''}$ be the subtree grafted on T_{main} that contains X_{ki} . Due to the T_{ijk} tree, $t_{k''}$ must also be on the path between w and $p(w)$. Thus in the subtree of T rooted at $\text{lca}_T(X_{ik}, X_{ki})$, there is at most one leaf other than X_{ik} and X_{ki} (namely w). This subtree must contain at least $n^{10} - 1$ losses, either for the W_{k+1} nodes if $i > k$, or the W_{i+1} nodes if $k > i$. We reach the same contradiction. $\square$

It only remains to show that edge colors are consistent between their two directions.

Claim 5 *Let $X_{ij}, X_{ji} \in \mathcal{X}_{E'}$. Then X_{ij}, X_{ji} have the same color.*

Proof Let v_k, v_l be the neighbors of v_i other than v_j . Suppose that X_{ij} and X_{ji} do not have the same color. If one of X_{ij} or X_{ji} is of color 3 and the other of color 1 or 2, then because of the T_{ijk} tree in the input, X_{ik} and X_{ki} cannot be a descendant of any of d_1, d_2 or d_3 . Hence they have no color, contradicting Claim 3. So we may assume that X_{ij} and X_{ji} are of color 1 and 2 (or vice-versa). Again because of the T_{ijk} tree, X_{ik} and X_{ki} must be of color 3. And because of the T_{ijl} tree, X_{il} and X_{li} must also be of color 3. But then, X_{ik} and X_{il} are both of color 3, contradicting Claim 4. $\square$

We can now color the edges of E as follows: color $v_i v_j$ with color $c \in \{1, 2, 3\}$ if and only if X_{ij} and X_{ji} have color c . By Claim 3 and Claim 5, each edge gets assigned a unique color. Two adjacent edges $v_i v_j$ and $v_i v_k$ get assigned the colors of X_{ij} and X_{ik} . By Claim 4, X_{ij} and X_{ik} have different colors. It follows that the edge coloring is proper, concluding the proof.