The complexity of computing optimum labelings for temporal connectivity

- Nina Klobas ⊠©
- Department of Computer Science, Durham University, UK
- George B. Mertzios ⊠[□]
- Department of Computer Science, Durham University, UK
- Hendrik Molter 🖂 🗅
- Department of Industrial Engineering and Management, Ben-Gurion University of the Negev, Israel
- Paul G. Spirakis 🖂 🗈
- Department of Computer Science, University of Liverpool, UK 10
- Computer Engineering & Informatics Department, University of Patras, Greece 11

- Abstract -12

A graph is temporally connected if there exists a strict temporal path, i.e., a path whose edges have 13 strictly increasing labels, from every vertex u to every other vertex v. In this paper we study temporal 14 design problems for undirected temporally connected graphs. The basic setting of these optimization 15 problems is as follows: given a connected undirected graph G, what is the smallest number $|\lambda|$ of 16 time-labels that we need to add to the edges of G such that the resulting temporal graph (G, λ) is 17 18 temporally connected? As it turns out, this basic problem, called MINIMUM LABELING (ML), can be optimally solved in polynomial time. However, exploiting the temporal dimension, the problem 19 becomes more interesting and meaningful in its following variations, which we investigate in this 20 paper. First we consider the problem MIN. AGED LABELING (MAL) of temporally connecting the 21 graph when we are given an upper-bound on the allowed age (i.e., maximum label) of the obtained 22 temporal graph (G, λ) . Second we consider the problem MIN. STEINER LABELING (MSL), where 23 the aim is now to have a temporal path between any pair of "important" vertices which lie in a 24 subset $R \subseteq V$, which we call the *terminals*. This relaxed problem resembles the problem STEINER 25 TREE in static (i.e., non-temporal) graphs. However, due to the requirement of strictly increasing 26 labels in a temporal path, STEINER TREE is not a special case of MSL. Finally we consider the 27 age-restricted version of MSL, namely MIN. AGED STEINER LABELING (MASL). Our main results 28 are threefold: we prove that (i) MAL becomes NP-complete on undirected graphs, while (ii) MASL 29 becomes W[1]-hard with respect to the number |R| of terminals. On the other hand we prove that 30 (iii) although the age-unrestricted problem MSL remains NP-hard, it is in FPT with respect to the 31 number |R| of terminals. That is, adding the age restriction, makes the above problems strictly 32 harder (unless P=NP or W[1]=FPT). 33

Due to lack of space, the full paper with all proofs is attached in a clearly marked 34 Appendix to be read at the discretion of the Program Committee. 35

2012 ACM Subject Classification Theory of computation \rightarrow Graph algorithms analysis; Mathem-36 atics of computing \rightarrow Discrete mathematics 37

Keywords and phrases Temporal graph, graph labeling, foremost temporal path, temporal con-38 nectivity, Steiner Tree. 39

- Digital Object Identifier 10.4230/LIPIcs.CVIT.2016.23 40
- Funding George B. Mertzios: Supported by the EPSRC grant EP/P020372/1. 41
- Hendrik Molter: Supported by the ISF, grant No. 1070/20. 42
- Paul G. Spirakis: Supported by the NeST initiative of the School of EEE and CS at the University 43
- of Liverpool and by the EPSRC grant EP/P02002X/1. 44

© Nina Klobas, George B. Mertzios, Hendrik Molter, and Paul G. Spirakis; licensed under Creative Commons License CC-BY 4.0

42nd Conference on Very Important Topics (CVIT 2016). Editors: John Q. Open and Joan R. Access; Article No. 23; pp. 23:1–23:14

Leibniz International Proceedings in Informatics

LIPICS Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany

23:2 The complexity of computing optimum labelings for temporal connectivity

45 **1** Introduction

⁴⁶ A temporal (or dynamic) graph is a graph whose underlying topology is subject to discrete ⁴⁷ changes over time. This paradigm reflects the structure and operation of a great variety of ⁴⁸ modern networks; social networks, wired or wireless networks whose links change dynamically, ⁴⁹ transportation networks, and several physical systems are only a few examples of networks ⁵⁰ that change over time [23, 32, 34]. Inspired by the foundational work of Kempe et al. [25], we ⁵¹ adopt here a simple model for temporal graphs, in which the vertex set remains unchanged ⁵² while each edge is equipped with a set of integer time-labels.

Definition 1 (temporal graph [25]). A temporal graph is a pair (G, λ) , where G = (V, E)is an underlying (static) graph and $\lambda : E \to 2^{\mathbb{N}}$ is a time-labeling function which assigns to every edge of G a set of discrete time-labels.

Here, whenever $t \in \lambda(e)$, we say that the edge e is *active* or *available* at time t. Throughout the paper we may refer to "time-labels" simply as "labels" for brevity. Furthermore, the *age* (or *lifetime*) $\alpha(G, \lambda)$ of the temporal graph (G, λ) is the largest time-label used in it, i.e., $\alpha(G, \lambda) = \max\{t \in \lambda(e) : e \in E\}$. One of the most central notions in temporal graphs is that of a *temporal path* (or *time-respecting path*) which is motivated by the fact that, due to causality, entities and information in temporal graphs can "flow" only along sequences of edges whose time-labels are strictly increasing, or at least non-decreasing.

▶ Definition 2 (temporal path). Let (G, λ) be a temporal graph, where G = (V, E) is the underlying static graph. A temporal path in (G, λ) is a sequence $(e_1, t_1), (e_2, t_2), \ldots, (e_k, t_k),$ where (e_1, e_2, \ldots, e_k) is a path in $G, t_i \in \lambda(e_i)$ for every $i = 1, 2, \ldots, k$, and $t_1 < t_2 < \ldots < t_k$.

A vertex v is temporally reachable (or reachable) from vertex u in (G, λ) if there exists 66 a temporal path from u to v. If every vertex v is reachable by every other vertex u in 67 (G,λ) , then (G,λ) is called *temporally connected*. Note that, for every temporally connected 68 temporal graph (G, λ) , we have that its age is at least as large as the diameter d_G of the 69 underlying graph G. Indeed, the largest label used in any temporal path between two 70 anti-diametrical vertices cannot be smaller than d_G . Temporal paths have been introduced 71 by Kempe et al. [25] for temporal graphs which have only one label per edge, i.e., $|\lambda(e)| = 1$ 72 for every edge $e \in E$, and this notion has later been extended by Mertzios et al. [27] to 73 temporal graphs with multiple labels per edge. Furthermore, depending on the particular 74 application, both variations of temporal paths with non-decreasing [6, 25, 26] and with strictly 75 increasing [15, 27] labels have been studied. In this paper we focus on temporal paths with 76 strictly increasing labels. Due to the very natural use of temporal paths in various contexts, 77 several path-related notions, such as temporal analogues of distance, diameter, reachability, 78 exploration, and centrality have also been studied [1-3,6,8,10,11,13,15-18,20,26,27,31,33,35]. 79 Furthermore, some non-path temporal graph problems have been recently introduced 80 too, including for example temporal variations of maximal cliques [7, 36], vertex cover [4, 21], 81 vertex coloring [30], matching [28], and transitive orientation [29]. Motivated by the need of 82 restricting the spread of epidemic, Enright et al. [15] studied the problem of removing the 83

smallest number of time-labels from a given temporal graph such that every vertex can only temporally reach a limited number of other vertices. Deligkas et al. [12] studied the problem of accelerating the spread of information for a set of sources to all vertices in a temporal graph, by only using delaying operations, i.e., by shifting specific time-labels to a later time slot. The problems studied in [12] are related but orthogonal to our temporal connectivity problems. Various other temporal graph modification problems have been also studied, see for example [6, 11, 13, 16, 33].

Nina Klobas, George B. Mertzios, Hendrik Molter, and Paul G. Spirakis

The time-labels of an edge e in a temporal graph indicate the discrete units of time (e.g., days, hours, or even seconds) in which e is active. However, in many real dynamic systems, e.g., in synchronous mobile distributed systems that operate in discrete rounds, or in unstable chemical or physical structures, maintaining an edge over time requires energy and thus comes at a cost. One natural way to define the *cost* of the whole temporal graph (G, λ) is the *total number* of time-labels used in it, i.e., the total cost of (G, λ) is $|\lambda| = \sum_{e \in E} |\lambda_e|$.

In this paper we study *temporal design* problems of undirected temporally connected 97 graphs. The basic setting of these optimization problems is as follows: given an undirected 98 graph G, what is the smallest number $|\lambda|$ of time-labels that we need to add to the edges 99 of G such that (G, λ) is temporally connected? As it turns out, this basic problem can be 100 optimally solved in polynomial time, thus answering to a conjecture made in [2]. However, 101 exploiting the temporal dimension, the problem becomes more interesting and meaningful in 102 its following variations, which we investigate in this paper. First we consider the problem 103 variation where we are given along with the input also an upper bound of the allowed age 104 (i.e., maximum label) of the obtained temporal graph (G, λ) . This age restriction is sensible 105 in more pragmatic cases, where delaying the latest arrival time of any temporal path incurs 106 further costs, e.g., when we demand that all agents in a safety-critical distributed network are 107 synchronized as quickly as possible, and with the smallest possible number of communications 108 among them. Second we consider problem variations where the aim is to have a temporal 109 path between any pair of "important" vertices which lie in a subset $R \subseteq V$, which we call 110 the *terminals*. For a detailed definition of our problems we refer to Section 2. 111

Here it is worth noting that the latter relaxation of temporal connectivity resembles the 112 problem STEINER TREE in static (i.e., non-temporal) graphs. Given a connected graph 113 G = (V, E) and a set $R \subseteq V$ of terminals, STEINER TREE asks for a smallest-sized subgraph 114 of G which connects all terminals in R. Clearly, the smallest subgraph sought by STEINER 115 TREE is a tree. As it turns out, this property does not carry over to the temporal case. 116 Consider for example an arbitrary graph G and a terminal set $R = \{a, b, c, d\}$ such that G 117 contains an induced cycle on four vertices a, b, c, d; that is, G contains the edges ab, bc, cd, da118 but not the edges ac or bd. Then, it is not hard to check that only way to add the smallest 119 number of time-labels such that all vertices of R are temporally connected is to assign one 120 label to each edge of the cycle on a, b, c, d, e.g., $\lambda(ab) = \lambda(cd) = 1$ and $\lambda(bc) = \lambda(cd) = 2$. 121 The main underlying reason for this difference with the static problem STEINER TREE is that 122 temporal connectivity is not transitive and not symmetric: if there exists temporal paths 123 from u to v, and from v to w, it is not a priori guaranteed that a temporal path from v to u, 124 or from u to w exists. 125

Temporal network design problems have already been considered in previous works. 126 Mertzios et al. [27] proved that it is APX-hard to compute a minimum-cost labeling for 127 temporally connecting an input *directed* graph G, where the age of the graph is upper-128 bounded by the diameter of G. This hardness reduction was strongly facilitated by the 129 careful placement of the edge directions in the constructed instance, in which every vertex 130 was reachable in the static graph by only constantly many vertices. Unfortunately this 131 cannot happen in an undirected connected graph, where every vertex is reachable by all 132 other vertices. Later, Akrida et al. [2] proved that it is also APX-hard to remove the largest 133 number of time-labels from a given temporally connected (undirected) graph (G, λ) , while still 134 maintaining temporal connectivity. In this case, although there are no edge directions, the 135 hardness reduction was strongly facilitated by the careful placement of the initial time-labels 136 of λ in the input temporal graph, in which every pair of vertices could be connected by only 137 a few different temporal paths, among which the solution had to choose. Unfortunately 138

23:4 The complexity of computing optimum labelings for temporal connectivity

this cannot happen when the goal is to add time-labels to an undirected connected graph,
where there are potentially multiple ways to temporally connect a pair of vertices (even if we
upper-bound the largest time-label by the diameter).

141 Summarizing, the above technical difficulties seem to be the reason why the problem of 142 adding the minimum number of time-labels with an age-restriction to an undirected graph to 143 achieve temporal connectivity remained open until now for the last decade. In this paper we 144 overcome these difficulties by developing a hardness reduction from a variation of the problem 145 MAX XOR SAT (see Theorem 12 in Section 3) where we manage to add the appropriate 146 (undirected) edges among the variable-gadgets such that simultaneously (i) the distance 147 between any two vertices from different variable gadgets remains small (constant) and (ii) 148 there is no shortest path between two vertices of the same variable gadget that leaves this 149 gadget. 150

Our contribution and road-map. In the first part of our paper, in Section 3, we present our results on MIN. AGED LABELING (MAL). This problem is the same as ML, with the additional restriction that we are given along with the input an upper bound on the allowed *age* of the resulting temporal graph (G, λ) . Using a technically involved reduction from a variation of MAX XOR SAT, we prove that MAL is NP-complete on undirected graphs, even when the required maximum age is equal to the diameter d_G of the input static graph G.

In the second part of our paper, in Section 4, we present our results on the Steiner-tree 158 versions of the problem, namely on MIN. STEINER LABELING (MSL) and MIN. AGED 159 STEINER LABELING (MASL). The difference of MSL from ML is that, here, the goal is to 160 have a temporal path between any pair of "important" vertices which lie in a given subset 161 $R \subseteq V$ (the terminals). In Section 4.1 we prove that MSL is NP-complete by a reduction 162 from VERTEX COVER, the correctness of which requires showing structural properties of 163 MSL. Here it is worth recalling that, as explained above, the classical problem STEINER 164 TREE on static graphs is not a special case of MSL, due to the requirement of strictly 165 increasing labels in a temporal path. Furthermore, we would like to emphasize here that, as 166 temporal connectivity is neither transitive nor symmetric, a straightforward NP-hardness 167 reduction from STEINER TREE to MSL does not seem to exist. For example, as explained 168 above, in a graph that contains a C_4 with its four vertices as terminals, labeling a Steiner 169 tree is sub-optimal for MSL. 170

In Section 4.2 we provide a fixed-parameter tractable (FPT) algorithm for MSL with 171 respect to the number |R| of terminal vertices, by providing a parameterized reduction to 172 STEINER TREE. The proof of correctness of our reduction, which is technically quite involved, 173 is of independent interest, as it proves crucial graph-theoretical properties of minimum 174 temporal STEINER labelings. In particular, for our algorithm we prove (see Lemma 14) 175 that, for any undirected graph G with a set R of terminals, there always exists at least one 176 minimum temporal STEINER labeling (G, λ) which labels edges either from (i) a tree or from 177 (ii) a tree with one extra edge that builds a C_4 . 178

In Section 4.3 we prove that MASL is W[1]-hard with respect to the number |R| of terminals. Our results actually imply the stronger statement that MASL is W[1]-hard even with respect to the number of time-labels of the solution (which is a larger parameter than the number |R| of terminals).

Finally, we complete the picture by providing some auxiliary results in our preliminary Section 2. More specifically, in Section 2.1 we prove that ML can be solved in polynomial time, and in Section 2.2 we prove that the analogue minimization versions of ML and MAL on directed acyclic graphs are solvable in polynomial time.

2 Preliminaries and notation 187

Given a (static) undirected graph G = (V, E), an edge between two vertices $u, v \in V$ 188 is denoted by uv, and in this case the vertices u, v are said to be *adjacent* in G. If the 189 graph is directed, we will use the ordered pair (u, v) (resp. (v, u)) to denote the oriented 190 edge from u to v (resp. from v to u). The age of a temporal graph (G, λ) is denoted by 191 $\alpha(G,\lambda) = \max\{t \in \lambda(e) : e \in E\}$. A temporal path $(e_1,t_1), (e_2,t_2), \ldots, (e_k,t_k)$ from vertex 192 u to vertex v is called *foremost*, if it has the smallest arrival time t_k among all temporal 193 paths from u to v. Note that there might be another temporal path from u to v that uses 194 fewer edges than a foremost path. A temporal graph (G, λ) is temporally connected if, for 195 every pair of vertices $u, v \in V$, there exists a temporal path (see Definition 2) P_1 from u 196 to v and a temporal path P_2 from v to u. Furthermore, given a set of terminals $R \subseteq V$, 197 the temporal graph (G, λ) is *R*-temporally connected if, for every pair of vertices $u, v \in R$, 198 there exists a temporal path from u to v and a temporal path from v to u; note that P_1 and 199 P_2 can also contain vertices from $V \setminus R$. Now we provide our formal definitions of our four 200 decision problems. 201

	Min. Labeling (ML)	Min. Aged Labeling (MAL)
202	Input: A static graph $G = (V, E)$ and	Input: A static graph $G = (V, E)$
	a $k \in \mathbb{N}$.	and two integers $a, k \in \mathbb{N}$.
	Question: Does there exist a temporally	Question: Does there exist a temporally
	connected temporal graph (G, λ) ,	connected temporal graph (G, λ) ,
	where $ \lambda \leq k$?	where $ \lambda \leq k$ and $\alpha(\lambda) \leq a$?
	Min. Steiner Labeling (MSL)	Min. Aged Steiner Labeling (MASL)
203	Input: A static graph $G = (V, E)$,	Input: A static graph $G = (V, E)$,
	a subset $R \subseteq V$ and a $k \in \mathbb{N}$.	a subset $R \subseteq V$, and two integers $a, k \in \mathbb{N}$.
	Question: Does there exist an temporally	Question: Does there exist a temporally

204	Note that, for both problems MAL and MASL, whenever the input age bound a is
205	strictly smaller than the diameter d of G , the answer is always NO. Thus, we always assume
206	in the remainder of the paper that $a \ge d$, where d is the diameter of the input graph G. For
207	simplicity of the presentation, we denote next by $\kappa(G, d)$ the smallest number k for which
208	(G, k, d) is a YES instance for MAL.

R-connected temporal graph (G, λ) ,

where $|\lambda| \leq k$ and $\alpha(\lambda) \leq a$?

▶ **Observation 3.** For every graph G with n vertices and diameter d, we have that $\kappa(G, d) \leq 1$ 209 n(n-1).210

The next lemma shows that the upper bound of Observation 3 is asymptotically tight as, 211 for cycle graphs C_n with diameter d, we have that $\kappa(C_n, d) = \Theta(n^2)$. 212

▶ Lemma 4. Let C_n be a cycle on n vertices, where $n \neq 4$, and let d be its diameter. Then 213

214
$$\kappa(C_n, d) = \begin{cases} d^2, & \text{when } n = 2d \\ 2d^2 + d, & \text{when } n = 2d + 1. \end{cases}$$

R-connected temporal graph (G, λ) ,

where $|\lambda| \leq k$?

23:6 The complexity of computing optimum labelings for temporal connectivity

215 2.1 A polynomial-time algorithm for ML

As a first warm-up, we study the problem ML, where no restriction is imposed on the 216 maximum allowed age of the output temporal graph. It is already known by Akrida et al. [2] 217 that any undirected graph can be made temporally connected by adding at most 2n-3218 time-labels, while for trees 2n-3 labels are also necessary. Moreover, it was conjectured 219 that every graph needs at least 2n - 4 time-labels [2]. Here we prove their conjecture true 220 by proving that, if G contains (resp. does not contain) the cycle C_4 on four vertices as a 221 subgraph, then (G, k) is a YES instance of ML if and only if $k \ge 2n - 4$ (resp. $k \ge 2n - 3$). 222 The proof is done via a reduction to the gossip problem [9] (for a survey on gossiping see 223 also [22]). 224

The related problem of achieving temporal connectivity by assigning to every edge of the 225 graph at most one time-label, has been studied by Göbel et al. [19], where the relationship 226 with the gossip problem has also been drawn. Contrary to ML, this problem is NP-hard [19]. 227 That is, the possibility of assigning two or more labels to an edge makes the problem 228 computationally much easier. Indeed, in a C_4 -free graph with n vertices, an optimal solution 229 to ML consists in assigning in total 2n-3 time-labels to the n-1 edges of a spanning 230 tree. In such a solution, one of these n-1 edges receives one time-label, while each of the 231 remaining n-2 edges receives two time-labels. Similarly, when the graph contains a C_4 , it 232 suffices to span the graph with four trees tooted at the vertices of the C_4 , where each of the 233 edges of the C_4 receives one time-label and each edge of the four trees receives two labels. 234 That is, a graph containing a C_4 can be temporally connected using 2n - 4 time-labels. 235

In the gossip problem we have n agents from a set A. At the beginning, every agent $x \in A$ holds its own secret. The goal is that each agent eventually learns the secret of every other agent. This is done by producing a sequence of unordered pairs (x, y), where $x, y \in A$ and each such pair represents one phone call between the agents involved, during which the two agents exchange all the secrets they currently know.

The above gossip problem is naturally connected to ML. The only difference between the two problems is that, in gossip, all calls are non-concurrent, while in ML we allow concurrent temporal edges, i.e., two or more edges can appear at the same time slot t. Therefore, in order to transfer the known results from gossip to ML, it suffices to prove that in ML we can equivalently consider solutions with non-concurrent edges.

▶ **Theorem 5.** Let G = (V, E) be a connected graph. Then the smallest $k \in \mathbb{N}$ for which (G, k) is a YES instance of ML is:

 $^{_{248}} \qquad k = \begin{cases} 2n-4, & \text{if } G \text{ contains } C_4 \text{ as a subgraph,} \\ 2n-3, & \text{otherwise.} \end{cases}$

249 2.2 A polynomial-time algorithm for directed acyclic graphs

As a second warm-up, we show that the minimization analogues of ML and MAL on 250 directed acyclic graphs (DAGs) are solvable in polynomial time. More specifically, for the 251 minimization analogue of ML we provide an algorithm which, given a DAG G = (V, A) with 252 diameter d_G , computes a temporal labeling function λ which assigns the smallest possible 253 number of time-labels on the arcs of G with the following property: for every two vertices 254 $u, v \in V$, there exists a directed temporal path from u to v in (G, λ) if and only if there 255 exists a directed path from u to v in G. Moreover, the age $\alpha(G, \lambda)$ of the resulting temporal 256 graph is equal to d_G . Therefore, this immediately implies a polynomial-time algorithm 257

²⁵⁸ for the minimization analogue of MAL on DAGs. For notation uniformity, we call these ²⁵⁹ minimization problems ML_{directed} and MAL_{directed}, respectively.

▶ **Theorem 6.** Let G = (V, E) be a DAG with n vertices and m arcs. Then $ML_{directed}(G)$ and $MAL_{directed}(G)$ can be both computed in O(n(n+m)) time.

²⁶² **3** MAL is NP-complete

In this section we prove that it is NP-hard to determine the number of labels in an optimal labeling of a static, undirected graph G, where the age, i.e., the maximum label used, is not larger than the diameter of the input graph.

To prove this we provide a reduction from the NP-hard problem MONOTONE MAX 266 XOR(3) (or MONMAXXOR(3) for short). This is a special case of the classical Boolean 267 satisfiability problem, where the input formula ϕ consists of the conjunction of monotone 268 XOR clauses of the form $(x_i \oplus x_i)$, i.e., variables x_i, x_i are non-negated. If each variable 269 appears in exactly r clauses, then ϕ is called a monotone MAX XOR(r) formula. A clause 270 $(x_i \oplus x_j)$ is XOR-satisfied (or simply satisfied) if and only if $x_i \neq x_j$. In MONOTONE MAX 271 XOR(r) we are trying to find a truth assignment τ of ϕ which satisfies the maximum number 272 of clauses. As it can be easily checked, MONMAXXOR(3) encodes the problem MAX-CUT 273 on cubic graphs, which is known to be NP-hard [5]. Therefore we conclude the following. 274

Theorem 7 ([5]). MONMAXXOR(3) is NP-hard.

Now we explain our reduction from MONMAXXOR(3) to the problem MINIMUM AGED 276 LABELING (MAL), where the input static graph G is undirected and the desired age of the 277 output temporal graph is the diameter d of G. Let ϕ be a monotone MAX XOR(3) formula 278 with n variables x_1, x_2, \ldots, x_n and m clauses C_1, C_2, \ldots, C_m . Note that $m = \frac{3}{2}n$, since each 279 variable appears in exactly 3 clauses. From ϕ we construct a static undirected graph G_{ϕ} with 280 diameter d = 10, and prove that there exists a truth assignment τ which satisfies at least 281 k clauses in ϕ , if and only if there exists a labeling λ_{ϕ} of G_{ϕ} , with $|\lambda_{\phi}| \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ 282 labels and with age $\alpha(G, \lambda) \leq 10$. 283

284 High-level construction

For each variable x_i , $1 \le i \le n$, we construct a variable gadget X_i that consists of a "starting" 285 vertex s_i and three "ending" vertices t_i^{ℓ} (for $\ell \in \{1, 2, 3\}$); these ending vertices correspond 286 to the appearances of x_i in three clauses of ϕ . In an optimum labeling $\lambda(\phi)$, in each variable 287 gadget there are exactly two labelings that temporally connect starting and ending vertices, 288 which correspond to the TRUE or FALSE truth assignment of the variable in the input formula 289 ϕ . For every clause $(x_i \oplus x_j)$ we identifying corresponding ending vertices of X_i and X_j 290 (as well as some other auxiliary vertices and edges). Whenever $(x_i \oplus x_j)$ is satisfied by a 291 truth assignment of ϕ , the labels of the common edges of X_i and X_j in an optimum labeling 292 coincide (thus using few labels); otherwise we need additional labels for the common edges 293 of X_i and X_j . 294

²⁹⁵ Detailed construction of G_{ϕ}

For each variable x_i from ϕ we create a variable gadget X_i , that consists of a base BX_i on 11 vertices, $BX_i = \{s_i, a_i, b_i, c_i, d_i, e_i, \overline{a_i}, \overline{b_i}, \overline{c_i}, \overline{d_i}, \overline{e_i}\}$, and three forks F^1X_i, F^2X_i, F^3X_i , each on 9 vertices, $F^{\ell}X_i = \{t_i^{\ell}, f_i^{\ell}, g_i^{\ell}, h_i^{\ell}, m_i^{\ell}, \overline{f_i}^{\ell}, \overline{g_i}^{\ell}, \overline{h_i}^{\ell}, \overline{m_i}^{\ell}\}$, where $\ell \in \{1, 2, 3\}$. Vertices in the base BX_i are connected in the following way: there are two paths of length 5: $s_i a_i b_i c_i d_i e_i$

23:8 The complexity of computing optimum labelings for temporal connectivity

and $s_i \overline{a_i} \overline{b_i} \overline{c_i} \overline{d_i} \overline{c_i}$, and 5 extra edges of form $y_i \overline{y_i}$, where $y \in \{a, b, c, d, e\}$. Vertices in each fork 300 $F^{\ell}X_i$ (where $\ell \in \{1, 2, 3\}$) are connected in the following way: there are two paths of length 301 4: $t_i^\ell m_i^\ell h_i^\ell g_i^\ell f_i^\ell$ and $t_i^\ell \overline{m_i}^\ell \overline{h_i}^\ell \overline{g_i}^\ell \overline{f_i}^\ell$, and 4 extra edges of form $y_i \overline{y_i}^\ell$, where $y \in \{m, h, g, f\}$. 302 The base BX_i of the variable gadget X_i is connected to each of the three forks $F^{\ell}X_i$ via two 303 edges $e_i f_i^{\ell}$ and $\overline{e_i f_i^{\ell}}$, where $\ell \in \{1, 2, 3\}$. For an illustration see Figure 1. 304

For an easier analysis we fix the following notation. The vertex $s_i \in BX_i$ is called 305 a start vertex of X_i , vertices t_i^{ℓ} ($\ell \in \{1, 2, 3\}$) are called *ending vertices* of X_i , a path 306 connecting s_i, t_i^{ℓ} that passes through vertices $a_i b_i c_i d_i e_i f_i^{\ell} g_i^{\ell} h_i^{\ell} m_i^{\ell}$ (resp. $\overline{a_i b_i} \dots \overline{m_i}^{\ell}$) is called 307 the left (resp. right) s_i, t_i^{ℓ} -path. The left (resp. right) s_i, t_i^{ℓ} -path is a disjoint union of the left 308 (resp. right) path on vertices of the base BX_i of X_i , an edge of form $e_i f_i^{\ell}$ (resp. $\overline{e_i f_i}^{\ell}$) called 309 the left (resp. right) bridge edge and the left (resp. right) path on vertices of the ℓ -th fork 310 $F^{\ell}X_i$ of X_i . The edges $y_i\overline{y_i}$, where $y \in \{a, b, c, d, e, f^{\ell}, g^{\ell}, h^{\ell}, m^{\ell}\}, \ell \in \{1, 2, 3\}$, are called 311 connecting edges. 312



Figure 1 An example of a variable gadget X_i in G_{ϕ} , corresponding to the variable x_i from ϕ .

Connecting variable gadgets 313

There are two ways in which we connect two variable gadgets, depending whether they 314 appear in the same clause in ϕ or not. 315

- 1. Two variables x_i, x_j do not appear in any clause together. In this case we add the 316 following edges between the variable gadgets X_i and X_j : 317
- = from e_i (resp. $\overline{e_i}$) to $f_j^{\ell'}$ and $\overline{f_j}^{\ell'}$, where $\ell' \in \{1, 2, 3\}$, = from e_j (resp. $\overline{e_j}$) to f_i^{ℓ} and $\underline{f_i}^{\ell}$, where $\ell \in \{1, 2, 3\}$, 318
- 319
- from d_i (resp. $\overline{d_i}$) to d_j and $\overline{d_j}$. 320



Figure 2 An example of two non-intersecting variable gadgets and variable edges among them.

We call these edges the *variable edges*. For an illustration see Figure 2. 321 2. Let $C = (x_i \oplus x_j)$ be a clause of ϕ , that contains the r-th appearance of the variable x_i 322 and r'-th appearance of the variable x_j . In this case we identify the r-th fork $F^r X_i$ of 323 X_i with the r'-th fork $F^{r'}X_i$ of X_i in the following way: 324 $t_{i}^{r} = t_{i}^{r'},$ 325 $\begin{array}{l} = & \{f_i^r, g_i^r, h_i^r, m_i^r\} = \{\overline{f_j}^{r'}, \overline{g_j}^{r'}, \overline{h_j}^{r'}, \overline{m_j}^{r'}\} \text{ respectively, and} \\ = & \{\overline{f_i}^r, \overline{g_i}^r, \overline{h_i}^r, \overline{m_i}^r\} = \{f_j^{r'}, g_j^{r'}, h_j^{r'}, m_j^{r'}\} \text{ respectively.} \end{array}$ 326 327 Besides that we add the following edges between the variable gadgets X_i and X_j : 328

- = from e_i (resp. $\overline{e_i}$) to $f_j^{\ell'}$ and $\overline{f_j}^{\ell'}$, where $\ell' \in \{1, 2, 3\} \setminus \{r'\}$, = from e_j (resp. $\overline{e_j}$) to f_i^{ℓ} and $\overline{f_i}^{\ell}$, where $\ell \in \{1, 2, 3\} \setminus \{r\}$, 329
- 330
- from d_i (resp. $\overline{d_i}$) to d_j and $\overline{d_j}$. 331
- For an illustration see Figure 3. 332

This finishes the construction of G_{ϕ} . Before continuing with the reduction, we prove the 333 following structural property of G_{ϕ} . 334

Lemma 8. The diameter d_{ϕ} of G_{ϕ} is 10. 335

▶ Theorem 9. If $OPT_{MONMAXXOR(3)}(\phi) \ge k$ then $OPT_{MAL}(G_{\phi}, d_{\phi}) \le \frac{13}{2}n^2 + \frac{99}{2}n - 8k$, where 336 n is the number of variables in the formula ϕ . 337

Before proving the statement in the other direction, we have to show some structural 338 properties. Let us fix the following notation. If a labeling λ_{ϕ} labels all left (resp. right) 339 paths of the variable gadget X_i (i.e., both bottom-up from s_i to t_i^1, t_i^2, t_i^3 and top-down from 340 t_i^1, t_i^2, t_i^3 to s_i with labels $1, 2, \ldots, 10$ in this order), then we say that the variable gadget X_i 341 is *left-aligned* (resp. *right-aligned*) in the labeling λ_{ϕ} . Note, if at least one edge on any of 342 these left (resp. right) paths of X_i is not labeled with the appropriate label between 1 and 343 10, then the variable gadget is not left-aligned (resp. not right-aligned). Every temporal 344 path from s_i to t_i^ℓ (resp. from t_i^ℓ to s_i) of length 10 in X_i is called an *upward path* (resp. a 345 downward path) in X_i . Any part of an upward (resp. downward) path is called a partial 346 upward (resp. downward) path. Note that, for any $\ell, \ell' \in \{1, 2, 3\}, \ell \neq \ell'$, a temporal path 347 from t_i^{ℓ} to $t_i^{\ell'}$ of length 10 is the union of a partial downward path on the fork F_i^{ℓ} and a 348

23:10 The complexity of computing optimum labelings for temporal connectivity



Figure 3 An example of two intersecting variable gadgets X_i, X_j corresponding to variables x_i, x_j , that appear together in some clause in ϕ , where it is the third appearance of x_i and the first appearance of x_j .

partial upward path on $F_i^{\ell'}$. Moreover, note that these two partial downward/upward paths must be either both parts of a left temporal path or both parts of a right temporal path between s_i and $t_i^{\ell}, t_i^{\ell'}$. The following technical lemma will allow us to prove the correctness of our reduction.

Lemma 10. Let λ_{ϕ} be a minimum labeling of G_{ϕ} . Then λ_{ϕ} can be modified in polynomial time to a minimum labeling of G_{ϕ} in which each variable gadget X_i is either left-aligned or right-aligned.

Theorem 11. If $OPT_{MAL}(G_{\phi}, d_{\phi}) \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ then $OPT_{MONMAXXOR(3)}(\phi) \geq k$, where n is the number of variables in the formula ϕ .

Since MAL is clearly in NP, the next theorem follows directly by Theorems 7, 9, and 11.

Theorem 12. MAL is NP-complete on undirected graphs, even when the required maximum
 age is equal to the diameter of the input graph.

4 The Steiner-Tree variations of the problem

In this section we investigate the computational complexity of the Steiner-Tree variations of the problem, namely MSL and MASL. First, we prove in Section 4.1 that the ageunrestricted problem MSL remains NP-hard, using a reduction from VERTEX COVER. In Section 4.2 we prove that this problem is in FPT, when parameterized by the number |R| of terminals. Finally, using a parameterized reduction from MULTICOLORED CLIQUE, we prove in Section 4.3 that the age-restricted version MASL is W[1]-hard with respect to |R|, even if the maximum allowed age is a constant.

369 4.1 MSL is NP-complete

Theorem 13. MSL *is NP-complete.* **3**70 **▶**



Figure 4 An example of construction of the input graph for MSL.

³⁷¹ **Proof sketch.** MSL is clearly contained in NP. To prove that the MSL is NP-hard we ³⁷² provide a polynomial-time reduction from the NP-complete VERTEX COVER problem [24].

VERTEX COVER

Input: A static graph G = (V, E), a positive integer k. **Question:** Does there exist a subset of vertices $S \subseteq V$ such that |S| = k and $\forall e \in E, e \cap S \neq \emptyset$.

Let (G, k) be an input of the VERTEX COVER problem and denote |V(G)| = n, |E(G)| = m. We assume w.l.o.g. that G does not admit a vertex cover of size k - 1. We construct (G^*, R^*, k^*) , the input of MSL using the following procedure. The vertex set $V(G^*)$ consists of the following vertices:

- ³⁷⁸ two starting vertices $N = \{n_0, n_1\},$
- a "vertex-vertex" corresponding to every vertex of G: $U_V = \{u_v | v \in V(G)\},\$
- an "edge-vertex" corresponding to every edge of G: $U_E = \{u_e | e \in E(G)\},\$
- 381 $= 2n + 12m \cdot k$ "dummy" vertices.
- ³⁸² The edge set $E(G^*)$ consists of the following edges:
- an edge between starting vertices, i.e., $n_0 n_1$,
- a path of length 3 between a starting vertex n_1 and every vertex-vertex $u_v \in U_V$ using 2 dummy vertices, and
- for every edge $e = vw \in E(G)$ we connect the corresponding edge-vertex u_e with the vertex-vertices u_v and u_w , each with a path of length 6k + 1 using 6k dummy vertices.
- We set $R^* = \{n_0\} \cup U_E$ and $k^* = 6k + 2m(6k+1) + 1$. This finishes the construction. It is not hard to see that this construction can be performed in polynomial time. For an illustration see Figure 4. Note that any two paths in G^* can intersect only in vertices from $N \cup U_V \cup U_E$ and not in any of the dummy vertices. At the end G^* is a graph with 3n + m(12k+1) + 2vertices and 1 + 3n + 2m(6k+1) edges.
- In the full proof we prove that (G, k) is a YES instance of the VERTEX COVER if and only if (G^*, R^*, k^*) is a YES instance of the MSL.

4.2 An FPT-algorithm for MSL with respect to the number of terminals

In this section we provide an FPT-algorithm for MSL, parameterized by the number |R| of terminals. The algorithm is based on a crucial structural property of minimum solutions for

23:12 The complexity of computing optimum labelings for temporal connectivity

³⁹⁹ MSL: there always exists a minimum labeling λ that labels the edges of a subtree of the ⁴⁰⁰ input graph (where every leaf is a terminal vertex), and potentially one further edge that ⁴⁰¹ forms a C_4 with three edges of the subtree.

Intuitively speaking, we can use an FPT-algorithm for STEINER TREE parameterized by
the number of terminals [14] to reveal a subgraph of the MSL instance that we can optimally
label using Theorem 5. Since the number of terminals in the created STEINER TREE instance
is larger than the number of terminals in the MSL instance by at most a constant, we obtain
an FPT-algorithm for MSL parameterized by the number of terminals.

⁴⁰⁷ ► Lemma 14. Let G = (V, E) be a graph, $R \subseteq V$ a set of terminals, and k be an integer ⁴⁰⁸ such that (G, R, k) is a YES instance of MSL and (G, R, k - 1) is a NO instance of MSL. ⁴⁰⁹ If k is odd, then there is a labeling λ of size k for G such that the edges labeled by λ form ⁴¹⁰ a tree, and every leaf of this tree is a vertex in R.

⁴¹¹ If k is even, then there is a labeling λ of size k for G such that the edges labeled by λ ⁴¹² form a graph that is a tree with one additional edge that forms a C₄, and every leaf of ⁴¹³ the tree is a vertex in R.

The main idea for the proof of Lemma 14 is as follows. Given a solution labeling λ , we 414 fix one terminal r^* and then (i) we consider the minimum subtree in which r^* can reach all 415 other terminal vertices and (ii) we consider the minimum subtree in which all other terminal 416 vertices can reach r^* . Intuitively speaking, we want to label the smaller one of those subtrees 417 using Theorem 5 and potentially adding an extra edge to form a C_4 ; we then argue that the 418 obtained labeling does not use more labels than λ . To do that, and to detect whether it is 419 possible to add an edge to create a C_4 , we make a number of modifications to the trees until 420 we reach a point where we can show that our solution is correct. 421

Having Lemma 14, we can now give our algorithm for MSL. As mentioned before, it uses an FPT-algorithm for STEINER TREE parameterized by the number of terminals [14] as a subroutine.

▶ **Theorem 15.** MSL is in FPT when parameterized by the number of terminals.

426 4.3 Parameterized Hardness of MASL

⁴²⁷ Note that, since MASL generalizes both MSL and MAL, NP-hardness of MASL is already ⁴²⁸ implied by both Theorems 12 and 13. In this section, we prove that MASL is W[1]-hard ⁴²⁹ when parameterized by the number |R| of the terminals, even if the restriction *a* on the ⁴³⁰ age is a constant. To this end, we provide a parameterized reduction from MULTICOLORED ⁴³¹ CLIQUE. This, together with Theorem 15, implies that MASL is strictly harder than MSL ⁴³² (parameterized by the number |R| of terminals), unless FPT=W[1].

▶ **Theorem 16.** MASL is W[1]-hard when parameterized by the number |R| of the terminals, even if the restriction *a* on the age is a constant.

Note here that, in the constructed instance of MASL in the proof of Theorem 16, the number of labels is also upper-bounded by a function of the number of colors in the instance of MULTICOLORED CLIQUE. Therefore the proof of Theorem 16 implies also the next result, which is even stronger (since in every solution of MASL the number of time-labels is lower-bounded by a function of the number |R| of terminals).

► Corollary 17. MASL is W[1]-hard when parameterized by the number k of time-labels, even if the restriction a on the age is a constant.

442		References
443	1	Eleni C. Akrida, Leszek Gasieniec, George B. Mertzios, and Paul G. Spirakis. Ephemeral
444		networks with random availability of links: The case of fast networks. Journal of Parallel and
445		Distributed Computing, 87:109–120, 2016.
446	2	Eleni C. Akrida, Leszek Gasieniec, George B. Mertzios, and Paul G. Spirakis. The complexity of
447		optimal design of temporally connected graphs. Theory of Computing Systems, 61(3):907-944,
448		2017.
449	3	Eleni C. Akrida, George B. Mertzios, Sotiris E. Nikoletseas, Christoforos L. Raptopoulos,
450		Paul G. Spirakis, and Viktor Zamaraev. How fast can we reach a target vertex in stochastic
451		temporal graphs? In Proceedings of the 46th International Colloquium on Automata, Languages,
452		and Programming, (ICALP), volume 132, pages 131:1–131:14, 2019.
453	4	Eleni C. Akrida, George B. Mertzios, Paul G. Spirakis, and Viktor Zamaraev. Temporal vertex
454		cover with a sliding time window. In Proceedings of the 45th International Colloquium on
455		Automata, Languages, and Programming (ICALP), pages 148:1–148:14, 2018.
456	5	Paola Alimonti and Viggo Kann. Hardness of approximating problems on cubic graphs.
457		In Proceedings of the 3rd Italian Conference on Algorithms and Complexity (CIAC), pages
458		288–298, 1997.
459	6	Kyriakos Axiotis and Dimitris Fotakis. On the size and the approximability of minimum
460		temporally connected subgraphs. In Proceedings of the 43rd International Colloquium on
461	_	Automata, Languages, and Programming, (ICALP), pages 149:1–149:14, 2016.
462	(Matthias Bentert, Anne-Sophie Himmel, Hendrik Molter, Marco Morik, Rolf Niedermeier,
463		and René Saitenmacher. Listing all maximal k -plexes in temporal graphs. ACM Journal of
464	0	Experimental Algorithmics, $24(1):13:1-13:27$, 2019.
465	8	Binh-Minh Bui-Xuan, Afonso Ferreira, and Aubin Jarry. Computing shortest, fastest, and
466		Foremost journeys in dynamic networks. International Journal of Foundations of Computer Science, 14(2):267–285, 2002
467	0	Dichard T. Pumby A problem with telephones. SIAM Journal on Algebraic and Discrete
468	9	Methode 2(1):13-18 1081
409	10	Sobastian Buß Handrik Moltar Bolf Niedermeier and Maciei Rymar Algerithmic aspects of
470	10	temporal betweenness. In Proceedings of the 26th ACM SIGKDD Conference on Knowledge
471		Discovery and Data Mining (KDD), pages 2084–2092. 2020.
473	11	Arnaud Casteigts, Joseph G. Peters, and Jason Schoeters. Temporal cliques admit sparse
474		spanners. Journal of Computer and Sustem Sciences, 121:1–17, 2021.
475	12	Argyrios Deligkas, Eduard Eiben, and George Skretas. Minimizing reachability times on
476		temporal graphs via shifting labels. CoRR, abs/2112.08797, 2021. URL: https://arxiv.org/
477		abs/2112.08797.
478	13	Argyrios Deligkas and Igor Potapov. Optimizing reachability sets in temporal graphs by
479		delaying. In Proceedings of the 34th Conference on Artificial Intelligence (AAAI), pages
480		9810–9817, 2020.
481	14	S.E. Dreyfus and R.A. Wagner. The steiner problem in graphs. <i>Networks</i> , 1:195–207, 1971.
482	15	Jessica Enright, Kitty Meeks, George B. Mertzios, and Viktor Zamaraev. Deleting edges
483		to restrict the size of an epidemic in temporal networks. Journal of Computer and System
484		Sciences, 119:60–77, 2021.
485	16	Jessica Enright, Kitty Meeks, and Fiona Skerman. Assigning times to minimise reachability in
486		temporal graphs. Journal of Computer and System Sciences, 115:169–186, 2021.
487	17	Thomas Erlebach, Michael Hoffmann, and Frank Kammer. On temporal graph exploration. In
488		Proceedings of the 42nd International Colloquium on Automata, Languages, and Programming
489		(ICALP), pages 444–455, 2015.
490	18	Thomas Erlebach and Jakob T. Spooner. Faster exploration of degree-bounded temporal
491		graphs. In Proceedings of the 43rd International Symposium on Mathematical Foundations of
492		Computer Science (MFCS), pages 36:1–36:13, 2018.

23:14 The complexity of computing optimum labelings for temporal connectivity

- ⁴⁹³ **19** F. Göbel, J.Orestes Cerdeira, and H.J. Veldman. Label-connected graphs and the gossip ⁴⁹⁴ problem. *Discrete Mathematics*, 87(1):29–40, 1991.
- Roman Haag, Hendrik Molter, Rolf Niedermeier, and Malte Renken. Feedback edge sets in
 temporal graphs. *Discrete Applied Mathematics*, 307:65–78, 2022.
- Thekla Hamm, Nina Klobas, George B. Mertzios, and Paul G. Spirakis. The complexity
 of temporal vertex cover in small-degree graphs. In *Proceedings of the 36th Conference on Artificial Intelligence (AAAI)*, 2022. To appear.
- Sandra M. Hedetniemi, Stephen T. Hedetniemi, and Arthur L. Liestman. A survey of gossiping and broadcasting in communication networks. *Networks*, 18(4):319–349, 1988.
- ⁵⁰² 23 Petter Holme and Jari Saramäki. *Temporal network theory*, volume 2. Springer, 2019.
- Richard M. Karp. Reducibility among combinatorial problems. In *Complexity of Computer Computations*, pages 85–103. Springer, 1972.
- ⁵⁰⁵ **25** David Kempe, Jon M. Kleinberg, and Amit Kumar. Connectivity and inference problems for ⁵⁰⁶ temporal networks. *Journal of Computer and System Sciences*, 64(4):820–842, 2002.
- Nina Klobas, George B. Mertzios, Hendrik Molter, Rolf Niedermeier, and Philipp Zschoche.
 Interference-free walks in time: Temporally disjoint paths. In *Proceedings of the 30th International Joint Conference on Artificial Intelligence (IJCAI)*, pages 4090–4096, 2021.
- George B. Mertzios, Othon Michail, Ioannis Chatzigiannakis, and Paul G. Spirakis. Temporal
 network optimization subject to connectivity constraints. In *Proceedings of the 40th Inter- national Colloquium on Automata, Languages and Programming (ICALP)*, pages 657–668,
 2013.
- George B Mertzios, Hendrik Molter, Rolf Niedermeier, Viktor Zamaraev, and Philipp Zschoche.
 Computing maximum matchings in temporal graphs. In *Proceedings of the 37th International Symposium on Theoretical Aspects of Computer Science (STACS)*, volume 154, pages 27:1–
 27:14, 2020.
- George B. Mertzios, Hendrik Molter, Malte Renken, Paul G. Spirakis, and Philipp Zschoche.
 The complexity of transitively orienting temporal graphs. In *Proceedings of the 46th International Symposium on Mathematical Foundations of Computer Science (MFCS)*, pages 75:1–75:18, 2021.
- George B. Mertzios, Hendrik Molter, and Viktor Zamaraev. Sliding window temporal graph
 coloring. Journal of Computer and System Sciences, 120:97–115, 2021.
- ⁵²⁴ 31 Othon Michail and Paul G. Spirakis. Traveling salesman problems in temporal graphs.
 ⁵²⁵ Theoretical Computer Science, 634:1–23, 2016.
- ⁵²⁶ **32** Othon Michail and Paul G. Spirakis. Elements of the theory of dynamic networks. *Commu*-⁵²⁷ *nications of the ACM*, 61(2):72–72, January 2018.
- Hendrik Molter, Malte Renken, and Philipp Zschoche. Temporal reachability minimization:
 Delaying vs. deleting. In Proceedings of the 46th International Symposium on Mathematical
 Foundations of Computer Science (MFCS '21), pages 76:1–76:15, 2021.
- ⁵³¹ 34 Vincenzo Nicosia, John Tang, Cecilia Mascolo, Mirco Musolesi, Giovanni Russo, and Vito
 ⁵³² Latora. Graph metrics for temporal networks. In *Temporal Networks*. Springer, 2013.
- Suhas Thejaswi, Juho Lauri, and Aristides Gionis. Restless reachability in temporal graphs.
 CoRR, abs/2010.08423, 2021. URL: https://arxiv.org/abs/2010.08423.
- ⁵³⁵ 36 Tiphaine Viard, Matthieu Latapy, and Clémence Magnien. Computing maximal cliques in
 ⁵³⁶ link streams. *Theoretical Computer Science*, 609:245–252, 2016.

The complexity of computing optimum labelings

for temporal connectivity

Nina Klobas ⊠©

Department of Computer Science, Durham University, UK

George B. Mertzios ⊠©

Department of Computer Science, Durham University, UK

Hendrik Molter 🖂 回

Department of Industrial Engineering and Management, Ben-Gurion University of the Negev, Israel 8

Paul G. Spirakis 🖂 🗅 q

Department of Computer Science, University of Liverpool, UK 10

Computer Engineering & Informatics Department, University of Patras, Greece 11

– Abstract -12

A graph is temporally connected if there exists a strict temporal path, i.e., a path whose edges have 13 strictly increasing labels, from every vertex u to every other vertex v. In this paper we study temporal 14 design problems for undirected temporally connected graphs. The basic setting of these optimization 15 problems is as follows: given a connected undirected graph G, what is the smallest number $|\lambda|$ of 16 time-labels that we need to add to the edges of G such that the resulting temporal graph (G, λ) is 17 temporally connected? As it turns out, this basic problem, called MINIMUM LABELING (ML), can 18 be optimally solved in polynomial time. However, exploiting the temporal dimension, the problem 19 becomes more interesting and meaningful in its following variations, which we investigate in this 20 paper. First we consider the problem MIN. AGED LABELING (MAL) of temporally connecting the 21 graph when we are given an upper-bound on the allowed age (i.e., maximum label) of the obtained 22 temporal graph (G, λ) . Second we consider the problem MIN. STEINER LABELING (MSL), where 23 the aim is now to have a temporal path between any pair of "important" vertices which lie in a 24 subset $R \subseteq V$, which we call the *terminals*. This relaxed problem resembles the problem STEINER 25 TREE in static (i.e., non-temporal) graphs. However, due to the requirement of strictly increasing 26 27 labels in a temporal path, STEINER TREE is not a special case of MSL. Finally we consider the age-restricted version of MSL, namely MIN. AGED STEINER LABELING (MASL). Our main results 28 are threefold: we prove that (i) MAL becomes NP-complete on undirected graphs, while (ii) MASL 29 becomes W[1]-hard with respect to the number |R| of terminals. On the other hand we prove that 30 (iii) although the age-unrestricted problem MSL remains NP-hard, it is in FPT with respect to the 31 number |R| of terminals. That is, adding the age restriction, makes the above problems strictly 32 harder (unless P=NP or W[1]=FPT). 33

2012 ACM Subject Classification Theory of computation \rightarrow Graph algorithms analysis; Mathem-34 atics of computing \rightarrow Discrete mathematics 35

Keywords and phrases Temporal graph, graph labeling, foremost temporal path, temporal con-36 nectivity, Steiner Tree. 37

Digital Object Identifier 10.4230/LIPIcs.CVIT.2016.23

38

- Funding George B. Mertzios: Supported by the EPSRC grant EP/P020372/1. 39
- Hendrik Molter: Supported by the ISF, grant No. 1070/20.
- Paul G. Spirakis: Supported by the NeST initiative of the School of EEE and CS at the University 41
- of Liverpool and by the EPSRC grant EP/P02002X/1.

⁴³ **1** Introduction

⁴⁴ A temporal (or dynamic) graph is a graph whose underlying topology is subject to discrete ⁴⁵ changes over time. This paradigm reflects the structure and operation of a great variety of ⁴⁶ modern networks; social networks, wired or wireless networks whose links change dynamically, ⁴⁷ transportation networks, and several physical systems are only a few examples of networks ⁴⁸ that change over time [24,33,35]. Inspired by the foundational work of Kempe et al. [26], we ⁴⁹ adopt here a simple model for temporal graphs, in which the vertex set remains unchanged ⁵⁰ while each edge is equipped with a set of integer time-labels.

▶ Definition 1 (temporal graph [26]). A temporal graph is a pair (G, λ) , where G = (V, E)is an underlying (static) graph and $\lambda : E \to 2^{\mathbb{N}}$ is a time-labeling function which assigns to every edge of G a set of discrete time-labels.

Here, whenever $t \in \lambda(e)$, we say that the edge e is *active* or *available* at time t. Throughout the paper we may refer to "time-labels" simply as "labels" for brevity. Furthermore, the *age* (or *lifetime*) $\alpha(G, \lambda)$ of the temporal graph (G, λ) is the largest time-label used in it, i.e., $\alpha(G, \lambda) = \max\{t \in \lambda(e) : e \in E\}$. One of the most central notions in temporal graphs is that of a *temporal path* (or *time-respecting path*) which is motivated by the fact that, due to causality, entities and information in temporal graphs can "flow" only along sequences of edges whose time-labels are strictly increasing, or at least non-decreasing.

▶ Definition 2 (temporal path). Let (G, λ) be a temporal graph, where G = (V, E) is the underlying static graph. A temporal path in (G, λ) is a sequence $(e_1, t_1), (e_2, t_2), \ldots, (e_k, t_k),$ where (e_1, e_2, \ldots, e_k) is a path in $G, t_i \in \lambda(e_i)$ for every $i = 1, 2, \ldots, k$, and $t_1 < t_2 < \ldots < t_k$.

A vertex v is temporally reachable (or reachable) from vertex u in (G, λ) if there exists 64 a temporal path from u to v. If every vertex v is reachable by every other vertex u in 65 (G,λ) , then (G,λ) is called *temporally connected*. Note that, for every temporally connected 66 temporal graph (G, λ) , we have that its age is at least as large as the diameter d_G of the 67 underlying graph G. Indeed, the largest label used in any temporal path between two 68 anti-diametrical vertices cannot be smaller than d_G . Temporal paths have been introduced 69 by Kempe et al. [26] for temporal graphs which have only one label per edge, i.e., $|\lambda(e)| = 1$ 70 for every edge $e \in E$, and this notion has later been extended by Mertzios et al. [28] to 71 temporal graphs with multiple labels per edge. Furthermore, depending on the particular 72 application, both variations of temporal paths with non-decreasing [6, 26, 27] and with strictly 73 increasing [15, 28] labels have been studied. In this paper we focus on temporal paths with 74 strictly increasing labels. Due to the very natural use of temporal paths in various contexts, 75 several path-related notions, such as temporal analogues of distance, diameter, reachability, 76 exploration, and centrality have also been studied [1-3,6,8,10,11,13,15-18,21,27,28,32,34,36]. 77

Furthermore, some non-path temporal graph problems have been recently introduced 78 too, including for example temporal variations of maximal cliques [7,37], vertex cover [4,22], 79 vertex coloring [31], matching [29], and transitive orientation [30]. Motivated by the need of 80 restricting the spread of epidemic, Enright et al. [15] studied the problem of removing the 81 smallest number of time-labels from a given temporal graph such that every vertex can only 82 temporally reach a limited number of other vertices. Deligkas et al. [12] studied the problem 83 of accelerating the spread of information for a set of sources to all vertices in a temporal 84 graph, by only using delaying operations, i.e., by shifting specific time-labels to a later time 85 slot. The problems studied in [12] are related but orthogonal to our temporal connectivity 86 problems. Various other temporal graph modification problems have been also studied, see 87 for example [6, 11, 13, 16, 34]. 88

The time-labels of an edge e in a temporal graph indicate the discrete units of time (e.g., days, hours, or even seconds) in which e is active. However, in many real dynamic systems, e.g., in synchronous mobile distributed systems that operate in discrete rounds, or in unstable chemical or physical structures, maintaining an edge over time requires energy and thus comes at a cost. One natural way to define the *cost* of the whole temporal graph (G, λ) is the *total number* of time-labels used in it, i.e., the total cost of (G, λ) is $|\lambda| = \sum_{e \in E} |\lambda_e|$.

In this paper we study *temporal design* problems of undirected temporally connected 95 graphs. The basic setting of these optimization problems is as follows: given an undirected 96 graph G, what is the smallest number $|\lambda|$ of time-labels that we need to add to the edges 97 of G such that (G, λ) is temporally connected? As it turns out, this basic problem can be 98 optimally solved in polynomial time, thus answering to a conjecture made in [2]. However, 99 exploiting the temporal dimension, the problem becomes more interesting and meaningful in 100 its following variations, which we investigate in this paper. First we consider the problem 101 variation where we are given along with the input also an upper bound of the allowed age 102 (i.e., maximum label) of the obtained temporal graph (G, λ) . This age restriction is sensible 103 in more pragmatic cases, where delaying the latest arrival time of any temporal path incurs 104 further costs, e.g., when we demand that all agents in a safety-critical distributed network are 105 synchronized as quickly as possible, and with the smallest possible number of communications 106 among them. Second we consider problem variations where the aim is to have a temporal 107 path between any pair of "important" vertices which lie in a subset $R \subseteq V$, which we call 108 the *terminals*. For a detailed definition of our problems we refer to Section 2. 109

Here it is worth noting that the latter relaxation of temporal connectivity resembles the 110 problem STEINER TREE in static (i.e., non-temporal) graphs. Given a connected graph 111 G = (V, E) and a set $R \subseteq V$ of terminals, STEINER TREE asks for a smallest-sized subgraph 112 of G which connects all terminals in R. Clearly, the smallest subgraph sought by STEINER 113 TREE is a tree. As it turns out, this property does not carry over to the temporal case. 114 Consider for example an arbitrary graph G and a terminal set $R = \{a, b, c, d\}$ such that G 115 contains an induced cycle on four vertices a, b, c, d; that is, G contains the edges ab, bc, cd, da116 but not the edges ac or bd. Then, it is not hard to check that only way to add the smallest 117 number of time-labels such that all vertices of R are temporally connected is to assign one 118 label to each edge of the cycle on $a, b, c, d, e.g., \lambda(ab) = \lambda(cd) = 1$ and $\lambda(bc) = \lambda(cd) = 2$. 119 The main underlying reason for this difference with the static problem STEINER TREE is that 120 temporal connectivity is not transitive and not symmetric: if there exists temporal paths 121 from u to v, and from v to w, it is not a priori guaranteed that a temporal path from v to u, 122 or from u to w exists. 123

Temporal network design problems have already been considered in previous works. 124 Mertzios et al. [28] proved that it is APX-hard to compute a minimum-cost labeling for 125 temporally connecting an input *directed* graph G, where the age of the graph is upper-126 bounded by the diameter of G. This hardness reduction was strongly facilitated by the 127 careful placement of the edge directions in the constructed instance, in which every vertex 128 was reachable in the static graph by only constantly many vertices. Unfortunately this 129 cannot happen in an undirected connected graph, where every vertex is reachable by all 130 other vertices. Later, Akrida et al. [2] proved that it is also APX-hard to remove the largest 131 number of time-labels from a given temporally connected (undirected) graph (G, λ) , while still 132 maintaining temporal connectivity. In this case, although there are no edge directions, the 133 hardness reduction was strongly facilitated by the careful placement of the initial time-labels 134 of λ in the input temporal graph, in which every pair of vertices could be connected by only 135 a few different temporal paths, among which the solution had to choose. Unfortunately 136

this cannot happen when the goal is to add time-labels to an undirected connected graph,
where there are potentially multiple ways to temporally connect a pair of vertices (even if we
upper-bound the largest time-label by the diameter).

Summarizing, the above technical difficulties seem to be the reason why the problem of 140 adding the minimum number of time-labels with an age-restriction to an undirected graph to 141 achieve temporal connectivity remained open until now for the last decade. In this paper we 142 overcome these difficulties by developing a hardness reduction from a variation of the problem 143 MAX XOR SAT (see Theorem 19 in Section 3) where we manage to add the appropriate 144 (undirected) edges among the variable-gadgets such that simultaneously (i) the distance 145 between any two vertices from different variable gadgets remains small (constant) and (ii) 146 there is no shortest path between two vertices of the same variable gadget that leaves this 147 gadget. 148

Our contribution and road-map. In the first part of our paper, in Section 3, we present our results on MIN. AGED LABELING (MAL). This problem is the same as ML, with the additional restriction that we are given along with the input an upper bound on the allowed *age* of the resulting temporal graph (G, λ) . Using a technically involved reduction from a variation of MAX XOR SAT, we prove that MAL is NP-complete on undirected graphs, even when the required maximum age is equal to the diameter d_G of the input static graph G.

In the second part of our paper, in Section 4, we present our results on the Steiner-tree 156 versions of the problem, namely on MIN. STEINER LABELING (MSL) and MIN. AGED 157 STEINER LABELING (MASL). The difference of MSL from ML is that, here, the goal is to 158 have a temporal path between any pair of "important" vertices which lie in a given subset 159 $R \subseteq V$ (the terminals). In Section 4.1 we prove that MSL is NP-complete by a reduction 160 from VERTEX COVER, the correctness of which requires showing structural properties of 161 MSL. Here it is worth recalling that, as explained above, the classical problem STEINER 162 TREE on static graphs is not a special case of MSL, due to the requirement of strictly 163 increasing labels in a temporal path. Furthermore, we would like to emphasize here that, as 164 temporal connectivity is neither transitive nor symmetric, a straightforward NP-hardness 165 reduction from STEINER TREE to MSL does not seem to exist. For example, as explained 166 above, in a graph that contains a C_4 with its four vertices as terminals, labeling a Steiner 167 tree is sub-optimal for MSL. 168

In Section 4.2 we provide a fixed-parameter tractable (FPT) algorithm for MSL with 169 respect to the number |R| of terminal vertices, by providing a parameterized reduction to 170 STEINER TREE. The proof of correctness of our reduction, which is technically quite involved, 171 is of independent interest, as it proves crucial graph-theoretical properties of minimum 172 temporal STEINER labelings. In particular, for our algorithm we prove (see Lemma 21) 173 that, for any undirected graph G with a set R of terminals, there always exists at least one 174 minimum temporal STEINER labeling (G, λ) which labels edges either from (i) a tree or from 175 (ii) a tree with one extra edge that builds a C_4 . 176

In Section 4.3 we prove that MASL is W[1]-hard with respect to the number |R| of terminals. Our results actually imply the stronger statement that MASL is W[1]-hard even with respect to the number of time-labels of the solution (which is a larger parameter than the number |R| of terminals).

Finally, we complete the picture by providing some auxiliary results in our preliminary Section 2. More specifically, in Section 2.1 we prove that ML can be solved in polynomial time, and in Section 2.2 we prove that the analogue minimization versions of ML and MAL on directed acyclic graphs are solvable in polynomial time.

¹⁸⁵ **2** Preliminaries and notation

Given a (static) undirected graph G = (V, E), an edge between two vertices $u, v \in V$ 186 is denoted by uv, and in this case the vertices u, v are said to be *adjacent* in G. If the 187 graph is directed, we will use the ordered pair (u, v) (resp. (v, u)) to denote the oriented 188 edge from u to v (resp. from v to u). The age of a temporal graph (G, λ) is denoted by 189 $\alpha(G,\lambda) = \max\{t \in \lambda(e) : e \in E\}$. A temporal path $(e_1,t_1), (e_2,t_2), \ldots, (e_k,t_k)$ from vertex 190 u to vertex v is called *foremost*, if it has the smallest arrival time t_k among all temporal 191 paths from u to v. Note that there might be another temporal path from u to v that uses 192 fewer edges than a foremost path. A temporal graph (G, λ) is temporally connected if, for 193 every pair of vertices $u, v \in V$, there exists a temporal path (see Definition 2) P_1 from u 194 to v and a temporal path P_2 from v to u. Furthermore, given a set of terminals $R \subseteq V$, 195 the temporal graph (G, λ) is *R*-temporally connected if, for every pair of vertices $u, v \in R$, 196 there exists a temporal path from u to v and a temporal path from v to u; note that P_1 and 197 P_2 can also contain vertices from $V \setminus R$. Now we provide our formal definitions of our four 198 decision problems. 199

200	MIN. LABELING (ML)	Min. Aged Labeling (MAL)
	Input: A static graph $G = (V, E)$ and	Input: A static graph $G = (V, E)$
	a $k \in \mathbb{N}$.	and two integers $a, k \in \mathbb{N}$.
	Question: Does there exist a temporally	Question: Does there exist a temporally
	connected temporal graph (G, λ) ,	connected temporal graph (G, λ) ,
	where $ \lambda \leq k$?	where $ \lambda \leq k$ and $\alpha(\lambda) \leq a$?
	MIN. STEINER LABELING (MSL)	MIN. AGED STEINER LABELING (MASL)

	MIN. STEINER LABELING (MSL)	MIN. AGED STEINER LABELING (MASL)
201	Input: A static graph $G = (V, E)$,	Input: A static graph $G = (V, E)$,
	a subset $R \subseteq V$ and a $k \in \mathbb{N}$.	a subset $R \subseteq V$, and two integers $a, k \in \mathbb{N}$.
	Question: Does there exist an temporally	Question: Does there exist a temporally
	<i>R</i> -connected temporal graph (G, λ) ,	<i>R</i> -connected temporal graph (G, λ) ,
	where $ \lambda \le k$?	where $ \lambda \leq k$ and $\alpha(\lambda) \leq a$?
	=	

Note that, for both problems MAL and MASL, whenever the input age bound a is strictly smaller than the diameter d of G, the answer is always NO. Thus, we always assume in the remainder of the paper that $a \ge d$, where d is the diameter of the input graph G. For simplicity of the presentation, we denote next by $\kappa(G, d)$ the smallest number k for which (G, k, d) is a YES instance for MAL.

Description 3. For every graph G with n vertices and diameter d, we have that $\kappa(G, d) \leq n(n-1)$.

Proof. For every vertex v of G = (V, E), consider a BFS tree T_v rooted at v, while every edge from a vertex $u \neq v$ to its parent in T_v is assigned the time-label dist(v, u), i.e., the length of the shortest path from v to u in G. Note that each of these time-labels is smaller than or equal to the diameter d of G. Clearly, each BFS tree T_v assigns in total n-1 time-labels to the edges of G, and thus the union of all BFS trees T_v , where $v \in V$, assign in total at most n(n-1) labels to the edges of G.

The next lemma shows that the upper bound of Observation 3 is asymptotically tight as, for cycle graphs C_n with diameter d, we have that $\kappa(C_n, d) = \Theta(n^2)$.

▶ Lemma 4. Let C_n be a cycle on n vertices, where $n \neq 4$, and let d be its diameter. Then

218 $\kappa(C_n, d) = \begin{cases} d^2, & \text{when } n = 2d \\ 2d^2 + d, & \text{when } n = 2d + 1. \end{cases}$

Proof. Let $V(C_n) = \{v_1, v_2, \dots, v_n\}$ be the vertices of C_n . In the following, if not specified otherwise, all subscripts are considered modulo n. We distinguish two cases, depending on the parity of n.

First, when n is odd, i.e., n = 2d + 1. In this case one can observe that for each vertex 222 $v_i \in V(C_n)$ there are exactly two vertices on the distance d from it, namely v_{i+d} (on the right 223 side of v_i) and v_{i-d} (on the left side of v_i). Therefore, the $(v_i, v_{i+d}/v_{i-d})$ and $(v_{i+d}/v_{i-d}, v_i)$ -224 temporal paths must be labeled using all labels from 1 to d, one per each edge. Note also 225 that each edge $v_i v_{i+1}$ lies on the d temporal paths when the starting vertex v_i is on the 226 left side of it $(j \in \{i, i-1, i-2, \dots, i-d\})$ and on d temporal paths, when the starting 227 vertex $v_{i'}$ is on the right side of it $(j' \in \{i, i+1, i+2, \ldots, i+d\})$. This results in edge $v_i v_{i+1}$ 228 admitting all labels. As this is true for any edge of C_n , each edge is labeled with all labels. 229 Therefore we need $n \cdot d = 2d^2 + 1$ labels to ensure the existence of temporal paths among 230 any two vertices in C_{2d+1} . 231

Now let us continue with the case when n is even, i.e., n = 2d. In this case each vertex 232 $v_i \in V(C_n)$ has exactly one vertex, $v_{i-d} = v_{i+d}$, on the distance d from it and two on the 233 distance d-1 from it $(v_{i-d+1} \text{ and } v_{i+d-1})$. Therefore we have to label two disjoint paths 234 starting in v_i , one of length d and the other of length d-1. Suppose that we chose the 235 following labeling to label the edges of C_n . Let $i \in \{1, 2, \ldots, d\}$, if the edge is of form $v_{2i}v_{2i+1}$ 236 then it is labeled with all even labels, $\{2, 4, 6, \dots, j\}$, where $j \leq d$, and if the edge is of form 237 v_{2i+1}, v_{2i} then it is labeled with all odd labels, $\{1, 3, 5, \ldots, j'\}$, where $j' \leq d$. Now vertices 238 v_{2i-1} and v_{2i} use the same labels (i.e., the same temporal paths), to reach all other vertices 239 from the cycle. Namely, the (v_{2i-1}, v_{2i+d-1}) -temporal path is of length d, uses all labels from 240 1 to d and visits vertices $v_{2i-1}, v_{2i}, v_{2i+1}, \ldots, v_{2i+d-1}$. Therefore v_{2i-1} and v_{2i} can reach 241 vertices $\{v_{2i+1}, v_{2i+2}, \ldots, v_{2i+d-1}\}$. Similarly, the (v_{2i}, v_{2i-d}) -temporal path is of length d, 242 uses all labels from 1 to d and visits vertices $v_{2i}, v_{2i-1}, v_{2i-2}, \ldots, v_{2i-d}$. So v_{2i-1} and v_{2i} 243 can reach vertices $\{v_{2i-2}, v_{2i-3}, \ldots, v_{2i-d}\}$. This implies that that v_{2i} and v_{2i-1} reach all 244 other vertices in the graph. This holds for any two endpoints of an edge in C_n . Therefore 245 we need $d \cdot \frac{n}{2} = d^2$ labels to ensure the existence of temporal paths among any two vertices 246 247 in C_{2d}

248 2.1 A polynomial-time algorithm for ML

As a first warm-up, we study the problem ML, where no restriction is imposed on the 249 maximum allowed age of the output temporal graph. It is already known by Akrida et al. [2] 250 that any undirected graph can be made temporally connected by adding at most 2n-3251 time-labels, while for trees 2n-3 labels are also necessary. Moreover, it was conjectured 252 that every graph needs at least 2n - 4 time-labels [2]. Here we prove their conjecture true 253 by proving that, if G contains (resp. does not contain) the cycle C_4 on four vertices as a 254 subgraph, then (G, k) is a YES instance of ML if and only if $k \ge 2n - 4$ (resp. $k \ge 2n - 3$). 255 The proof is done via a reduction to the gossip problem [9] (for a survey on gossiping see 256 also [23]). 257

The related problem of achieving temporal connectivity by assigning to every edge of the graph at most one time-label, has been studied by Göbel et al. [20], where the relationship with the gossip problem has also been drawn. Contrary to ML, this problem is NP-hard [20].

That is, the possibility of assigning two or more labels to an edge makes the problem 261 computationally much easier. Indeed, in a C_4 -free graph with n vertices, an optimal solution 262 to ML consists in assigning in total 2n-3 time-labels to the n-1 edges of a spanning 263 tree. In such a solution, one of these n-1 edges receives one time-label, while each of the 264 remaining n-2 edges receives two time-labels. Similarly, when the graph contains a C_4 , it 265 suffices to span the graph with four trees tooted at the vertices of the C_4 , where each of the 266 edges of the C_4 receives one time-label and each edge of the four trees receives two labels. 267 That is, a graph containing a C_4 can be temporally connected using 2n - 4 time-labels. 268

In the gossip problem we have n agents from a set A. At the beginning, every agent $x \in A$ holds its own secret. The goal is that each agent eventually learns the secret of every other agent. This is done by producing a sequence of unordered pairs (x, y), where $x, y \in A$ and each such pair represents one phone call between the agents involved, during which the two agents exchange all the secrets they currently know.

The above gossip problem is naturally connected to ML. The only difference between the two problems is that, in gossip, all calls are non-concurrent, while in ML we allow concurrent temporal edges, i.e., two or more edges can appear at the same time slot t. Therefore, in order to transfer the known results from gossip to ML, it suffices to prove that in ML we can equivalently consider solutions with non-concurrent edges (see Lemma 6).

From the set of agents A and a sequence of calls $C = c(1), c(2), \ldots, c(m)$ we build a temporal graph $\mathcal{G}_{\mathcal{C}} = (G, \lambda)$ by the following procedure. For every agent $x \in A$ we create a vertex $v_x \in V(G)$. Every phone call c(i) between two agents x, y gives rise to a time edge $(v_x v_y, i)$ of $\mathcal{G}_{\mathcal{C}}$. Therefore the labeling λ is defined by the sequence of phone calls. Since no two calls are concurrent, we can order them linearly: for every $1 \leq i \leq m$, the phone call c(i)gives the label i to the edge between the two agents involved.

▶ Observation 5. If the sequence c(1), c(2), ..., c(m) of m phone calls results in all agents knowing all secrets, then the above construction produces a temporally connected temporal graph $\mathcal{G}_{\mathcal{C}} = (G, \lambda)$ with $|\lambda| = m$.

Now note that the temporal graph $\mathcal{G}_{\mathcal{C}}$ produced by the above procedure has the special property that, for every time-label t = 1, 2, ..., m, there exists exactly one edge labeled with t. In the next lemma we prove the reverse statement of Observation 5.

▶ Lemma 6. Let (G, λ) be an arbitrary temporally connected temporal graph with $|\lambda| = m$ time-labels in total. Then there exists a sequence c(1), c(2), ..., c(m) of m phone calls that results in all agents knowing all secrets.

Proof. Let (G, λ) be an arbitrary temporally connected temporal graph. W.l.o.g. we may assume that, for every $t = 1, 2, ..., \alpha(G, \lambda)$, there exists at least one edge e such that $t \in \lambda(e)$. Indeed, if such an edge does not exist in (G, λ) , we can replace in (G, λ) every label t' > t by t' - 1, thus obtaining another temporally connected graph with a smaller age.

Now we proceed as follows. Let $t \in \{1, 2, \ldots, \alpha(G, \lambda)\}$ be an arbitrary time step within 298 the lifetime of (G, λ) , and let $\{e_{i_k}\}_{k=1}^t$ be the edges of G such that $t \in \lambda(e_{i_k})$. Let $\varepsilon = \frac{1}{2t}$. 299 For every $k = 1, \ldots, t$, we replace the label t of the edge e_{i_k} by the label $t + k\varepsilon$. Finally, 300 we normalize the new time-labels of the edges of G such that they become the distinct 301 consecutive natural numbers from 1 to m (since $|\lambda| = m$ by the assumption of the lemma). 302 Denote the resulting temporal graph by (G, λ') . Note that every temporal path in (G, λ) 303 corresponds to a temporal path in (G, λ') with the same sequence of edges, and vice versa. 304 Finally we create the required sequence of phone calls as follows: for every $i = 1, 2, \ldots, m$, 305 if (G, λ') contains the edge e with time-label i, we add a phone call c(i) between the two 306

endpoints of the edge e. Since both (G, λ) aquid (G, λ') are temporally connected, it follows that after the sequence $c(1), c(2), \ldots, c(m)$ of calls results in every agent knowing every secret. This completes the proof.

Now denote with f(n) the minimum number of calls needed to complete gossiping among a set A of n agents, where a specific set of pairs of vertices $B \subseteq A \times A$ are allowed to make a direct call between each other. Let $G_0 = (A, B)$ be the (static) graph having the agents in A as vertices and the pairs of B among them as edges. Then it is known by [9] that, if G_0 contains a C_4 as a subgraph then f(n) = 2n - 4, while otherwise f(n) = 2n - 3. Therefore the next theorem follows by Observation 5 and Lemma 6 and by the results of [9].

Theorem 7. Let G = (V, E) be a connected graph. Then the smallest $k \in \mathbb{N}$ for which (G, k) is a YES instance of ML is:

318
$$k = \begin{cases} 2n-4, & \text{if } G \text{ contains } C_4 \text{ as a subgraph}, \\ 2n-3, & \text{otherwise.} \end{cases}$$

³¹⁹ 2.2 A polynomial-time algorithm for directed acyclic graphs

As a second warm-up, we show that the minimization analogues of ML and MAL on directed 320 acyclic graphs (DAGs) are solvable in polynomial time. More specifically, for the minimization 321 analogue of ML we provide an algorithm which, given a DAG G = (V, A) with diameter 322 d_G , computes a temporal labeling function λ which assigns the smallest possible number of 323 time-labels on the arcs of G with the following property: for every two vertices $u, v \in V$, there 324 exists a directed temporal path from u to v in (G, λ) if and only if there exists a directed 325 path from u to v in G. Moreover, the age $\alpha(G, \lambda)$ of the resulting temporal graph is equal to 326 d_G . Therefore, this immediately implies a polynomial-time algorithm for the minimization 327 analogue of MAL on DAGs. For notation uniformity, we call these minimization problems 328 $ML_{directed}$ and $MAL_{directed}$, respectively. First we define a *canonical layering* of a DAG, 329 which is useful for our algorithm. 330

▶ Definition 8. Let G = (V, A) be a DAG with n vertices, m arcs, and diameter d. A partition $L_0, L_1, L_2, \ldots, L_d$ of V into d+1 sets is a canonical layering of G if, for every $0 \le i \le d$, the set L_i contains all the source vertices in the induced subgraph $G_i := G[\{L_i, L_{i+1}, \ldots, L_d\}].$

An example of a canonical layering of a DAG G is illustrated in Figure 1.



Figure 1 Example of a canonical layering.

▶ Lemma 9. Let G = (V, E) be a DAG with n vertices and m arcs. We can produce the canonical layering of G in linear O(n + m) time.

Proof. First we initialize an auxiliary vertex subset $S = \emptyset$ and a counter $s_v = 0$ for every 337 vertex v. We start by computing the vertices of L_0 in O(n+m) time by just visiting all 338 vertices and arcs of G; L_0 contains all vertices u such that $N^-(u) = \emptyset$. Now, for every $i \ge 0$ 339 we proceed as follows. First we set $S = \emptyset$. Then, for every arc (u, v), where $u \in L_i$, we add 340 v to S and we increase the counter s_v by 1. Then we set $L_{i+1} = \{v \in S : s_v = |N^-(v)|\}$. 341 Before we continue to the next iteration i + 1, we reset the set S to be \emptyset , and we iterate until 342 we reach all vertices of G, i.e., until we add every vertex u to one of the sets L_0, L_1, \ldots, L_d . 343 It is easy to check that the above procedure is correct, as at every iteration i + 1 (where 344 $i \geq 0$) we include to L_i all vertices v which have zero in-degree in the graph induced by the 345 vertices in $V \setminus \bigcup_{k=1}^{i} L_k$. Furthermore, the running time is clearly O(n+m) as we visit each 346 vertex and arc a constant number of times. 347

³⁴⁸ The following observations will be useful when considering the canonical layering.

b Observation 10. Each layer L_i is an independent set in G.

Observation 11. For every i = 0, 1, ..., d-1 and every $u \in L_i$, there exists an arc $(u, v) \in A$ such that $v \in L_{i+1}$.

Solution 12. For every arc $(u, v) \in A$, where $u \in L_i$ and $v \in L_{i+1}$ for some $i \in \{0, 1, \dots, d-1\}$, there is no directed path of length two or more from u to v in G.

³⁵⁴ We use the canonical layering to prove the following result.

▶ Theorem 13. Let G = (V, E) be a DAG with n vertices and m arcs. Then $ML_{directed}(G)$ and $MAL_{directed}(G)$ can be both computed in O(n(n+m)) time.

Proof. For the purposes of simplicity of the proof, we denote by $\kappa(G)$ the optimum value 357 of $ML_{directed}$ with the DAG G as its input. First we calculate the canonical layering 358 L_0, L_1, \ldots, L_d of G in O(n+m) time by Lemma 9. For simplicity of the presentation, denote 359 by G_v the induced subgraph of G that contains v and all vertices that are reachable by v 360 in G with a directed path. Let d_v be the diameter of G_v ; note that d_v is the length of the 361 longest shortest directed path in G that starts at v. For every vertex $u \in V$, we define the 362 set $L_0^u = \{u\}$ and we initialize the set $S_u = N^+(u)$. Then, similarly to the proof of Lemma 9, 363 we iterate over all vertices $v \in S_u = N^+(u)$ and over all vertices $w \in N^+(v)$. Whenever we 364 encounter a vertex $w \in N^+(v) \cap N^+(u)$, we remove v from S_u . At the end of this procedure, 365 the set S_u contains exactly those vertices of $v \in N^+(u)$, for which there is no directed path of 366 length two or more from u to v in G. The above procedure can be completed in O(n(n+m))367 time, as for every vertex u, we iterate at most over all arcs in G a constant number of times. 368 Now we define the labeling λ of G as follows: Every arc $(u, v) \in A$, where $u \in L_i$, $v \in L_i$, 369 and $v \in S_u$, gets the label $\lambda((u, v)) = j$. Note here that $1 \leq \lambda((u, v)) \leq d$ for every arc of G, 370 and thus the age $\alpha(G,\lambda)$ of the resulting temporal graph is equal to the diameter d of G. 371 We will prove that $|\lambda| = \kappa(G)$. To prove that $|\lambda| \leq \kappa(G)$, it suffices to show that every label 372 of λ must participate in every temporal labeling of G which preserves temporal reachability. 373 In fact, this is true as the only arcs of G, which have a label in λ , are those arcs (u, v) such 374 that there is no other directed path from u to v. That is, in order to preserve temporal 375

³⁷⁶ reachability, we need to assign at least one label to all these arcs.

Conversely, to prove that $|\lambda| \geq \kappa(G)$, it suffices to show that λ preserves all temporal reachabilities. For this, observe first that, every directed path $P = (a, \ldots, b)$ in G can be transformed to a directed path $P' = (a, \ldots, b)$ such that, for every arc (u, v) in P', there is no other directed path from u to v in G apart from the arc (u, v) (i.e., there is no "shortcut"

from u to v in G). Therefore, since every arc in P' is assigned a label in λ and these labels are increasing along P', it follows that λ preserves all temporal reachabilities, and thus $|\lambda| \ge \kappa(G)$. Summarizing, $|\lambda| = \kappa(G)$ and the labeling λ can be computed in O(n(n+m))time.

Finally, since $\alpha(G, \lambda) = d$, the obtained optimum labeling for ML is also an optimum labeling for MAL (provided that the upper bound *a* in the input of MAL is at least *d*).

387 **3** MAL is NP-complete

In this section we prove that it is NP-hard to determine the number of labels in an optimal labeling of a static, undirected graph G, where the age, i.e., the maximum label used, is not larger than the diameter of the input graph.

To prove this we provide a reduction from the NP-hard problem MONOTONE MAX 391 XOR(3) (or MONMAXXOR(3) for short). This is a special case of the classical Boolean 392 satisfiability problem, where the input formula ϕ consists of the conjunction of monotone 393 XOR clauses of the form $(x_i \oplus x_j)$, i.e., variables x_i, x_j are non-negated. If each variable 394 appears in exactly r clauses, then ϕ is called a monotone MAX XOR(r) formula. A clause 395 $(x_i \oplus x_j)$ is XOR-satisfied (or simply satisfied) if and only if $x_i \neq x_j$. In MONOTONE MAX 396 XOR(r) we are trying to find a truth assignment τ of ϕ which satisfies the maximum number 397 of clauses. As it can be easily checked, MONMAXXOR(3) encodes the problem MAX-CUT 398 on cubic graphs, which is known to be NP-hard [5]. Therefore we conclude the following. 399

400 ► Theorem 14 ([5]). MONMAXXOR(3) *is NP-hard*.

Now we explain our reduction from MONMAXXOR(3) to the problem MINIMUM AGED LABELING (MAL), where the input static graph G is undirected and the desired age of the output temporal graph is the diameter d of G. Let ϕ be a monotone MAX XOR(3) formula with n variables x_1, x_2, \ldots, x_n and m clauses C_1, C_2, \ldots, C_m . Note that $m = \frac{3}{2}n$, since each variable appears in exactly 3 clauses. From ϕ we construct a static undirected graph G_{ϕ} with diameter d = 10, and prove that there exists a truth assignment τ which satisfies at least k clauses in ϕ , if and only if there exists a labeling λ_{ϕ} of G_{ϕ} , with $|\lambda_{\phi}| \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ labels and with age $\alpha(G, \lambda) \leq 10$.

409 High-level construction

For each variable x_i , $1 \le i \le n$, we construct a variable gadget X_i that consists of a "starting" 410 vertex s_i and three "ending" vertices t_i^{ℓ} (for $\ell \in \{1, 2, 3\}$); these ending vertices correspond 411 to the appearances of x_i in three clauses of ϕ . In an optimum labeling $\lambda(\phi)$, in each variable 412 gadget there are exactly two labelings that temporally connect starting and ending vertices, 413 which correspond to the TRUE or FALSE truth assignment of the variable in the input formula 414 ϕ . For every clause $(x_i \oplus x_j)$ we identifying corresponding ending vertices of X_i and X_j 415 (as well as some other auxiliary vertices and edges). Whenever $(x_i \oplus x_i)$ is satisfied by a 416 truth assignment of ϕ , the labels of the common edges of X_i and X_j in an optimum labeling 417 coincide (thus using few labels); otherwise we need additional labels for the common edges 418 419 of X_i and X_j .

420 Detailed construction of G_{ϕ}

For each variable x_i from ϕ we create a variable gadget X_i , that consists of a base BX_i on 11 vertices, $BX_i = \{s_i, a_i, b_i, c_i, d_i, e_i, \overline{a_i}, \overline{b_i}, \overline{c_i}, \overline{d_i}, \overline{e_i}\}$, and three forks F^1X_i, F^2X_i, F^3X_i , each

on 9 vertices, $F^{\ell}X_i = \{t_i^{\ell}, f_i^{\ell}, g_i^{\ell}, h_i^{\ell}, \overline{m_i}^{\ell}, \overline{g_i}^{\ell}, \overline{h_i}^{\ell}, \overline{m_i}^{\ell}\}$, where $\ell \in \{1, 2, 3\}$. Vertices in the base BX_i are connected in the following way: there are two paths of length 5: $s_ia_ib_ic_id_ie_i$ and $s_i\overline{a_i}\overline{b_i}\overline{c_i}\overline{d_i}\overline{e_i}$, and 5 extra edges of form $y_i\overline{y_i}$, where $y \in \{a, b, c, d, e\}$. Vertices in each fork $F^{\ell}X_i$ (where $\ell \in \{1, 2, 3\}$) are connected in the following way: there are two paths of length 425 $F^{\ell}X_i$ (where $\ell \in \{1, 2, 3\}$) are connected in the following way: there are two paths of length 426 $F^{\ell}X_i$ (where $\ell \in \{1, 2, 3\}$) are connected in the following way: there are two paths of length 427 4: $t_i^{\ell}m_i^{\ell}h_i^{\ell}g_i^{\ell}f_i^{\ell}$ and $t_i^{\ell}\overline{m_i}^{\ell}\overline{h_i}^{\ell}\overline{g_i}^{\ell}\overline{f_i}^{\ell}$, and 4 extra edges of form $y_i\overline{y_i}^{\ell}$, where $y \in \{m, h, g, f\}$. 428 The base BX_i of the variable gadget X_i is connected to each of the three forks $F^{\ell}X_i$ via two 429 edges $e_if_i^{\ell}$ and $\overline{e_i}\overline{f_i}^{\ell}$, where $\ell \in \{1, 2, 3\}$. For an illustration see Figure 2.

For an easier analysis we fix the following notation. The vertex $s_i \in BX_i$ is called 430 a start vertex of X_i , vertices t_i^{ℓ} ($\ell \in \{1, 2, 3\}$) are called *ending vertices* of X_i , a path 431 connecting s_i, t_i^{ℓ} that passes through vertices $a_i b_i c_i d_i e_i f_i^{\ell} g_i^{\ell} h_i^{\ell} m_i^{\ell}$ (resp. $\overline{a_i} \overline{b_i} \dots \overline{m_i}^{\ell}$) is called 432 the left (resp. right) s_i, t_i^{ℓ} -path. The left (resp. right) s_i, t_i^{ℓ} -path is a disjoint union of the left 433 (resp. right) path on vertices of the base BX_i of X_i , an edge of form $e_i f_i^{\ell}$ (resp. $\overline{e_i} \overline{f_i}^{\ell}$) called 434 the left (resp. right) bridge edge and the left (resp. right) path on vertices of the ℓ -th fork 435 $F^{\ell}X_i$ of X_i . The edges $y_i\overline{y_i}$, where $y \in \{a, b, c, d, e, f^{\ell}, g^{\ell}, h^{\ell}, m^{\ell}\}, \ell \in \{1, 2, 3\}$, are called 436 connecting edges. 437



Figure 2 An example of a variable gadget X_i in G_{ϕ} , corresponding to the variable x_i from ϕ .

438 Connecting variable gadgets

⁴³⁹ There are two ways in which we connect two variable gadgets, depending whether they ⁴⁴⁰ appear in the same clause in ϕ or not.

- ⁴⁴¹ 1. Two variables x_i, x_j do not appear in any clause together. In this case we add the ⁴⁴² following edges between the variable gadgets X_i and X_j :
- $\text{ = from } e_i \text{ (resp. } \overline{e_i} \text{) to } f_j^{\ell'} \text{ and } \overline{f_j}^{\ell'}, \text{ where } \ell' \in \{1, 2, 3\},$



Figure 3 An example of two non-intersecting variable gadgets and variable edges among them.

- = from e_j (resp. $\overline{e_j}$) to f_i^{ℓ} and $\overline{f_i}^{\ell}$, where $\ell \in \{1, 2, 3\}$, = from d_i (resp. $\overline{d_i}$) to d_j and $\overline{d_j}$. 444
- 445
- We call these edges the *variable edges*. For an illustration see Figure 3. 446
- 2. Let $C = (x_i \oplus x_j)$ be a clause of ϕ , that contains the r-th appearance of the variable x_i 447 and r'-th appearance of the variable x_i . In this case we identify the r-th fork $F^r X_i$ of 448 X_i with the r'-th fork $F^{r'}X_j$ of X_j in the following way: 449
- $t_{i}^{r} = t_{i}^{r'}, t_{i}^{r'},$ 450

$$\begin{array}{rcl} & \quad & \quad \\ & \quad$$

Besides that we add the following edges between the variable gadgets
$$X_i$$
 and X_j :

- = from e_i (resp. $\overline{e_i}$) to $f_j^{\ell'}$ and $\overline{f_j}^{\ell'}$, where $\ell' \in \{1, 2, 3\} \setminus \{r'\}$, = from e_j (resp. $\overline{e_j}$) to f_i^{ℓ} and $\overline{f_i}^{\ell}$, where $\ell \in \{1, 2, 3\} \setminus \{r\}$, 454
- 455
- from d_i (resp. $\overline{d_i}$) to d_j and $\overline{d_j}$. 456
- For an illustration see Figure 4. 457

This finishes the construction of G_{ϕ} . Before continuing with the reduction, we prove the 458 following structural property of G_{ϕ} . 459

Lemma 15. The diameter d_{ϕ} of G_{ϕ} is 10. 460

Proof. We prove this in two steps. First we show that the diameter of any variable gadget is 461 10 and then show that the diameter does not increase, when the variable edges are introduced, 462 i.e., vertices in any two variable gadgets are at most 10 apart. 463

Let us start with fixing a variable gadget X_i . A path from the starting vertex s_i to any 464 ending vertex t_{ℓ}^{ℓ} ($\ell \in \{1, 2, 3\}$) has to go through at least one of the vertices from $\{a_i, \overline{a_i}\}$, 465 then through at least one of the vertices from $\{b_i, \overline{b_i}\}$, then through $\{c_i, \overline{c_i}\}, \{d_i, \overline{d_i}\}, \{e_i, \overline{e_i}\}, \{e$ 466 $\{f_i^{\ell}, \overline{f_i}^{\ell}\}, \{g_i^{\ell}, \overline{g_i}^{\ell}\}, \{h_i^{\ell}, \overline{h_i}^{\ell}\}$ and finally through $\{m_i^{\ell}, \overline{m_i}^{\ell}\}$, before reaching the ending vertex. 467 The shortest s_i, t_i^{ℓ} path will go through exactly one vertex from each of the above sets. 468 Therefore it is of length 10. Because of the construction of X_i , there are exactly two s_i, t_i^{ℓ} 469 paths of length 10, which are edge and vertex disjoint, as they share only the starting and 470 ending vertices. One of this paths uses the vertices $a_i, b_i, c_i, d_i, e_i, f_i^{\ell}, g_i^{\ell}, h_i^{\ell}, m_i^{\ell}$ (i.e., the left 471



Figure 4 An example of two intersecting variable gadgets X_i, X_j corresponding to variables x_i, x_j , that appear together in some clause in ϕ , where it is the third appearance of x_i and the first appearance of x_j .

path) and the other uses vertices $\overline{a_i}, \overline{b_i}, \ldots, \overline{m_i}^{\ell}$ (i.e., the right path). A path between any two 472 ending vertices $t_i^{\ell}, t_i^{\ell'}$ (where $\ell, \ell' \in \{1, 2, 3\}$ and $\ell \neq \ell'$), has to go through the following sets of 473 vertices, $\{m_i^{\ell}, \overline{m_i}^{\ell}\}, \{m_i^{\ell'}, \overline{m_i}^{\ell'}\}, \{h_i^{\ell}, \overline{h_i}^{\ell'}\}, \{h_i^{\ell'}, \overline{h_i}^{\ell'}\}, \{g_i^{\ell}, \overline{g_i}^{\ell}\}, \{g_i^{\ell'}, \overline{g_i}^{\ell'}\}, \{f_i^{\ell}, \overline{f_i}^{\ell}\}, \{f_i^{\ell'}, \overline{f_i}^{\ell'}\}, \{f_i^{\ell'}, \overline{f_i$ 47 $\{e_i, \overline{e_i}\}$. Similarly as before, the shortest path uses exactly one vertex from each set and is 475 of size 10. Even more, there are exactly two $t_i^\ell, t_i^{\ell'}$ paths of length 10. They are edge and 476 vertex disjoint, as they share only the starting and ending vertices. One of this paths uses 477 the vertices without the line in the label (i.e., the left path) and the other uses vertices with 478 the line in the label (i.e., the right path). It is not hard to see that the distance between any 479 other vertex in X_i and starting or ending vertices is at most 9, as that vertex lies on one 480 of the s_i, t_i^{ℓ} or $t_i^{\ell}, t_i^{\ell'}$ -paths, but it is not an endpoint of it. By the similar reasoning there 481 exists a path between any two vertices in X_i (different than s_i, t_i^{ℓ}), of distance at most 9. 482 Therefore the diameter of X_i is 10. 483

Now let us fix two variable gadgets X_i, X_j , that share no fork (i.e., x_i and x_j appear in 484 no clause of ϕ). The shortest path from the starting vertex s_i of X_i to the starting vertex 485 s_j of X_j has to reach vertex d_i (resp. $\overline{d_i}$), which is done in 4 steps, from where it connects 486 to either d_j or $\overline{d_j}$, using a variable edge, and continues toward s_j , with 4 edges. Therefore, 487 $d(s_i, s_j) = 9$. The shortest path connecting vertex s_i with $t_i^{\ell'}$, uses one of the vertices e_i or 488 $\overline{e_i}$, that are on the distance 5 from s_i , then using one variable edge reaches $f_j^{\ell'}$ or $\overline{f_j}^{\ell'}$, which 489 is on the distance 4 from the ending vertex $t_i^{\ell'}$. Therefore, $d(s_i, t_i^{\ell'}) = 10$, for all $\ell' \in \{1, 2, 3\}$. 490 Lastly, the shortest path between an ending vertex t_i^{ℓ} of X_i and an ending vertex $t_j^{\ell'}$ uses 491 4 edges in the fork $F^{\ell}X_i$ to reach the vertex f_i^{ℓ} or f_i^{ℓ} , from where it uses a variable edge 492 that connects it to the vertex e_j or $\overline{e_j}$, that is on the distance 5 from the $t_j^{\ell'}$. Therefore, 493 $d(t_i^{\ell}, t_i^{\ell'}) = 10$, for all $\ell, \ell' \in \{1, 2, 3\}$. It is not hard to see that if two variable gadgets X_i, X_j 494 share a fork the shortest path among any two vertices does not increase. 495

We proved that the distance among any two vertices in G_{ϕ} is at most 10 and thus its diameter is 10.

Theorem 16. If $OPT_{MONMAXXOR(3)}(\phi) \ge k$ then $OPT_{MAL}(G_{\phi}, d_{\phi}) \le \frac{13}{2}n^2 + \frac{99}{2}n - 8k$, where n is the number of variables in the formula ϕ .

Proof. Let τ be an optimum truth assignment of ϕ , i.e., a truth assignment that satisfies at 500 least k clauses of ϕ . We will prove that there exists a temporal labeling λ_{ϕ} of G_{ϕ} which uses 501 $|\lambda_{\phi}| \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ labels, such that (G, λ) is temporally connected and $\alpha(G, \lambda) = d_{\phi} = 10$. 502 Recall that, since ϕ is an instance of MONMAXXOR(3) with *n* variables, it has $m = \frac{3}{2}n$ 503 clauses. We build the labeling λ_{ϕ} using the following rules. For an illustration see Figure 5. 504 1. If a variable x_i from ϕ is set to be TRUE by the truth assignment τ , we label the edges in 505 X_i in the following way: 506 all three left (s_i, t_i^{ℓ}) -paths, for all $\ell \in \{1, 2, 3\}$, get the labels $1, 2, 3, \ldots, 10$, one on each 507 edge, 508 similarly, all left (t_i^{ℓ}, s_i) -paths, get the labels $1, 2, 3, \ldots, 10$, one on each edge, 509 all connecting edges (i.e., edges of form $y_i \overline{y_i}$, where $y \in \{a, b, c, d, e, f^{\ell}, g^{\ell}, h^{\ell}, m^{\ell}\}$) get 510 the labels 1 and 10. 511 If a variable x_i from ϕ is set to be FALSE by the truth assignment τ , we label the edges 512 in X_i in the following way: 513 all three right (s_i, t_i^{ℓ}) -paths, for all $\ell \in \{1, 2, 3\}$, get the labels $1, 2, 3, \ldots, 10$, one on 514 each edge, 515 similarly, all right (t_i^{ℓ}, s_i) -paths, get the labels $1, 2, 3, \ldots, 10$, one on each edge, 516 all connecting edges get the labels 1 and 10. 517 Labeling λ_{ϕ} uses 10 labels on the left (resp. right) path of the base BX_i , 10 labels on the 518 left (resp. right) path of each fork $F^{\ell}X_i$, where $\ell \in \{1, 2, 3\}$ and $10 + 3 \cdot 8$ labels on the 519 connecting edges. All in total λ_{ϕ} uses 74 labels on the variable gadget X_i . 520 We still need to prove that there exists a temporal path among any two vertices in 521 X_i . There is a (unique) temporal path from the starting s_i vertex to all three ending 522 vertices t_i^{ℓ} , where $\ell \in \{1, 2, 3\}$, using left (in case of x_i being TRUE) or right (in case of x_i 523 being FALSE) paths of the base BX_i and forks $F^{\ell}X_i$. Similarly it holds for all temporal 524 (t_i^{ℓ}, s_i) -paths. The temporal path connecting two ending vertices $t_i^{\ell_1}, t_i^{\ell_2}$, uses first the left 525 (in case of x_i being TRUE) or right (in case of x_i being FALSE) path of the fork $F^{\ell_1}X_i$ to 526 reach e_i (in case of x_i being TRUE) or $\overline{e_i}$ (in case of x_i being FALSE), using the labels 527 1 to 5, and then continues on the left (in case of x_i being TRUE) or right (in case of x_i 528 being FALSE) path of the $F^{\ell_2}X_i$ from e_i or $\overline{e_i}$ to $t_i^{\ell_2}$, using labels 6 to 10. Any vertex 529 not on the left (in case of x_i being TRUE) or right (in case of x_i being FALSE) path, can 530 reach the starting vertex or any of the ending vertices, using a connecting edge at time 1. 531 Similarly it hold for the paths in the opposite direction, where the connecting edges have 532 the label 10. A temporal path among two vertices not on the left (in case of x_i being 533 TRUE) or right (in case of x_i being FALSE) path uses first a connecting edge at time 1, 534 then a portion of the left (in case of x_i being TRUE) or right (in case of x_i being FALSE) 535 path and again the appropriate connecting edge at time 10. This proves that λ_{ϕ} on X_i 536 admits a temporal path among any two vertices in X_i . 537

⁵³⁸ **2.** If two variable gadgets X_i and X_j do not share a fork, i.e., variables x_i and x_j are not in ⁵³⁹ the same clause in ϕ , and are both set to TRUE by τ , then we label the following variable ⁵⁴⁰ gadgets:

⁵⁴¹ = the edge $d_i d_j$, connecting the left path of BX_i with the left path of BX_j , gets the ⁵⁴² label 5,

three edges of the form $e_i f_j^{\ell'}$ ($\ell' \in \{1, 2, 3\}$), that connect the left path of BX_i to left paths of $F^{\ell'}X_j$, with the labels 4 and 6,

three edges of the form $e_j f_i^{\ell}$ ($\ell \in \{1, 2, 3\}$), that connect the left path of BX_j to left paths of $F^{\ell}X_i$, with the labels 4 and 6.

The labeling λ_{ϕ} uses 74 labels for each variable gadget and 13 labels on 7 variable edges that connect both variable gadgets. Note, the three other combinations (x_i, x_j) are both FALSE, one of x_i, x_j is TRUE and the other FALSE) give rise to the labeling λ_{ϕ} that uses the same number of labels on both variable gadgets and variable edges, where the labeled variable edges are chosen appropriately.

Since labeling variable edges does not change the labeling on each variable gadget, we 552 know that there is still a temporal path among any two vertices from the same variable 553 gadget. We need to prove now that there is a temporal path among any two vertices 554 from X_i and X_j . The edge $d_i d_j$, with the label 5, connects all the vertices from the 555 $BX_i \setminus \{e_i, \overline{e_i}\}$ to the vertices from the $BX_j \setminus \{e_j, \overline{e_j}\}$ and vice versa. To go from the 556 starting vertex s_i of X_i to the ending vertex t_j^{ℓ} of X_j we use the following route. From s_i 557 to e_i we use the left labeled path on X_i with labels from 1 to 5, then the edge $e_i f_j^{\ell'}$ at 558 time 6 to reach the corresponding fork $F^{ell'}X_j$ of X_j and from $f_i^{\ell'}$ to the ending vertex 559 $t_i^{\ell'}$ we use the left labeled path of X_j with labels 7 to 10. This temporal path connects all 560 vertices in the base BX_i to all vertices in the forks $FX_i^{\ell'}$, where $\ell' \in \{1, 2, 3\}$. Similar we 561 obtain temporal paths from vertices in the base BX_j to vertices in the forks FX_i^{ℓ} , where 562 $\ell \in \{1,2,3\}$. To go from any vertex in the fork $F^{\ell}X_i$ to any vertex of the X_i we use 563 the following route. First, we reach the vertex f_i^{ℓ} , by the time 4, using the left labeled 564 path of X_i . Then we use the edge $f_i^{\ell} e_j$ at time 5. Now, by the construction of λ_{ϕ} of X_j , 565 each vertex in X_i can be reached from e_i from time 5 to 10. Therefore all vertices from 566 $F^{\ell}X_i$ can reach any vertex in X_j . This is true for all $\ell \in \{1, 2, 3\}$. Similarly it holds for 567 temporal paths from any vertex in the fork $F^{\ell'}X_j$ ($\ell' \in \{1, 2, 3\}$) to vertices of the X_i . 568 The only thing left to show is that the vertices $\{e_i, \overline{e_i} \text{ can reach all other vertices in } BX_j$. 569 This is true as there is a temporal path using the edge $e_i f_j^{\ell'}$ at time 5 and then, from 570 $f_i^{\ell'}$ to any vertex in the base BX_j , the left labeled path of BX_j , that is labeled by λ_{ϕ} . 571 This is true for all $\ell' \in \{1, 2, 3\}$. Similarly it holds for the temporal paths from $\{e_j, \overline{e_j}\}$ 572 to the vertices in BX_i . Therefore λ_{ϕ} admits a temporal path among any two vertices of 573 variable gadgets, that do not share the fork. 574

- **3.** If two variable gadgets X_i and X_j share a fork, i.e., variables x_i and x_j are in the same clause, are both set to TRUE and $F^r X_i = F^{r'} X_j$, then we label the following variable edges:
 - = the edge $d_i d_j$, connecting the left path of BX_i and BX_j , gets the label 5,

578

⁵⁷⁹ = two edges of the form $e_i f_j^{\ell'}$ ($\ell' \in \{1, 2, 3\} \setminus \{r'\}$), that connect the left path of BX_i to ⁵⁸⁰ left paths of $F^{\ell'}X_j$, with the labels 4 and 6,

⁵⁸¹ = two edges of the form $e_j f_i^{\ell}$ ($\ell \in \{1, 2, 3\} \setminus \{r\}$), that connect the left path of BX_j to ⁵⁸² left paths of $F^{\ell}X_i$, with the labels 4 and 6.

The labeling λ_{ϕ} uses 9 labels on 5 variable edges that connect both variable gadgets. Note, the three other combinations $(x_i, x_j \text{ are both FALSE}, \text{ one of } x_i, x_j \text{ is TRUE} \text{ and}$ the other FALSE) give rise to the labeling λ_{ϕ} that uses the same number of labels on variable edges, where the labeled edges are chosen accordingly to the truth values of x_i and x_j . The only difference is in the labeling of the shared fork $F^r X_i = F^{r'} X_j$. There are two possibilities, one when the truth value of x_i and x_j is the same and one when it is different, i.e., $x_i = x_j$ or $x_i \neq x_j$.



(and the rules of how to identify vertices of the two forks), the left labeling of $F^r X_i$ coincides with the right labeling of $F^{r'} X_j$. Therefore λ_{ϕ} uses $2 \cdot 74 - 16 = 132$ labels on both variable gadgets.

b) Let us now observe the case when $x_i = x_j$. W.l.o.g. we can assume that both variables are TRUE. In the labeling λ_{ϕ} we label all left paths of both variable gadgets. By the construction of the graph G_{ϕ} (and the rules of how to identify vertices of the two forks), the fork $F^r X_i = F^{r'} X_j$ gets labeled from both sides, i.e., all edges in the fork get 2 labels. Therefore λ_{ϕ} uses $2 \cdot 74 - 8 = 140$ labels on both variable gadgets.

Identifying two forks $F^{r}X_{i} = F^{r'}X_{j}$ and labeling them using the union of both labelings on each fork, preserves temporal paths among all the vertices from X_{i} and X_{j} . This is true as the labeling in each variable is not changed by the labeling in the other variable. Among forks that are not in the intersection there are still the variable edges left, which assure that vertices from different variable gadgets can reach them or can be reached by them. Therefore the labeling λ_{ϕ} admits a temporal path among any two vertices from the variable gadgets X_{i}, X_{j} , that have a fork in the intersection.

Summarizing all of the above we get that the labeling λ_{ϕ} uses 74 labels on each variable gadget and 13 labels on variable edges among any two variables, from which we have to subtract the following:

⁶¹¹ = 4 labels for each pairs of variable edges between two variables that appear in the same ⁶¹² clause,

613 – 16 labels for the shared fork between two variables, that appear in a satisfied clause,

⁶¹⁴ ■ 8 labels for the shared fork between two variables, that appear in a non-satisfied clause. ⁶¹⁵ Altogether sums up to the $74n + 13\frac{n(n-1)}{2} - 4m - 16k - 8(m-k)$ labels. Therefore, if τ ⁶¹⁶ satisfies at least k clauses of ϕ , the labeling λ_{ϕ} consists of at most $\frac{13}{2}n^2 + \frac{99}{2}n - 8k$ labels.

Before proving the statement in the other direction, we have to show some structural 617 properties. Let us fix the following notation. If a labeling λ_{ϕ} labels all left (resp. right) 618 paths of the variable gadget X_i (i.e., both bottom-up from s_i to t_i^1, t_i^2, t_i^3 and top-down from 619 t_i^1, t_i^2, t_i^3 to s_i with labels $1, 2, \ldots, 10$ in this order), then we say that the variable gadget X_i 620 is left-aligned (resp. right-aligned) in the labeling λ_{ϕ} . Note, if at least one edge on any of 621 these left (resp. right) paths of X_i is not labeled with the appropriate label between 1 and 622 10, then the variable gadget is not left-aligned (resp. not right-aligned). Every temporal 623 path from s_i to t_i^{ℓ} (resp. from t_i^{ℓ} to s_i) of length 10 in X_i is called an *upward path* (resp. a 624 downward path) in X_i . Any part of an upward (resp. downward) path is called a partial 625 upward (resp. downward) path. Note that, for any $\ell, \ell' \in \{1, 2, 3\}, \ell \neq \ell'$, a temporal path 626 from t_i^{ℓ} to $t_i^{\ell'}$ of length 10 is the union of a partial downward path on the fork F_i^{ℓ} and a 627 partial upward path on $F_i^{\ell'}$. Moreover, note that these two partial downward/upward paths 628 must be either both parts of a left temporal path or both parts of a right temporal path 629 between s_i and $t_i^\ell, t_i^{\ell'}$. The following technical lemma will allow us to prove the correctness 630 of our reduction. 631

Lemma 17. Let λ_{ϕ} be a minimum labeling of G_{ϕ} . Then λ_{ϕ} can be modified in polynomial time to a minimum labeling of G_{ϕ} in which each variable gadget X_i is either left-aligned or right-aligned.

⁶³⁵ **Proof.** Let λ_{ϕ} be a minimum labeling of G_{ϕ} that admits at least one variable gadget X_i ⁶³⁶ that is neither left-aligned nor right-aligned.

First we will prove that there exists a fork $F^{\ell}X_i$ of X_i that admits at least three partial upward or downward paths, i.e., it either has two partial upward paths (one on each side of



(a) x_i and x_j do not appear together in any clause.



(b) x_i and x_j appear together in a clause, where x_i appears with its third and x_j with its first appearance.

Figure 5 Example of the labeling λ on variable gadgets X_i, X_j and variable edges between them, where x_i is TRUE and x_j FALSE in ϕ . Note, edges that are not labeled are omitted, $F^3X_i = F^1X_j$ and $t_i^3 = t_j^1$.

the fork) and at least one partial downward path, or two partial downward paths (one on each side of the fork) and at least one partial upward path. For the sake of contradiction, suppose that each of the forks F^1X_i, F^2X_i, F^3X_i contains at most two partial upward or downward paths. Then, since λ_{ϕ} must have in X_i at least one upward and at least one downward path between s_i and $t_i^{\ell}, \ell \in \{1, 2, 3\}$, it follows that each fork $F^{\ell}X_i$ has exactly

one partial upward and *exactly* one partial downward path.

Assume that each of the forks F^1X_i, F^2X_i, F^3X_i has both its partial upward and down-645 ward paths on the same side of X_i (i.e., either both on the left or both on the right side of 646 X_i). If all of them have their partial upward and downward paths on the left (resp. right) 647 side of X_i , then X_i is left-aligned (resp. right-aligned), which is a contradiction. Therefore, 648 at least one fork (say F^1X_i) has its partial upward and downward paths on the left side of 649 X_i and at least one other fork (say F^2X_i) has its partial upward and downward paths on 650 the right side of X_i . But then there is no temporal path from t_i^1 to t_i^2 of length 10 in λ_{ϕ} , 651 which is a contradiction. Therefore there exists at least one fork $F^{\ell}X_i$ (say, F^1X_i w.l.o.g.), 652 in which (w.l.o.g.) the partial upward path is on the right side and the partial downward 653 path is on the left side of X_i . 654

Since the partial downward path of F^1X_i is on the left side of X_i , it follows that the 655 partial upward path of each of F^2X_i and F^2X_i is on the left side of X_i . Indeed, otherwise 656 there is no temporal path of length 10 from t_i^1 to t_i^2 or t_i^3 in λ_{ϕ} , a contradiction. Similarly, 657 since the partial upward path of F^1X_i is on the right side of X_i , it follows that the partial 658 downward path of each of F^2X_i and F^2X_i is on the right side of X_i . But then, there is no 659 temporal path of length 10 from t_i^2 to t_i^3 , or from t_i^3 to t_i^2 in λ_{ϕ} , which is also a contradiction. 660 Therefore at least one fork $F^{\ell}X_i$ (say F^3X_i) of X_i admits at least three partial upward or 661 downward paths. 662

⁶⁶³ W.l.o.g. we can assume that the fork F^3X_i has two partial downward paths and at least ⁶⁶⁴ one partial upward path which is on the left side of X_i . We distinguish now the following ⁶⁶⁵ cases.

Case A. The fork F^3X_i has no partial upward path on the right side of X_i . Then the base BX_i has a partial upward path on the left side of X_i . Furthermore, each of the forks F^1X_i, F^2X_i has a partial downward path on the left side of X_i .

Case A-1. The base BX_i of X_i has no partial downward path on the left side of X_i ; that is, there is no temporal path from vertex e_i to vertex s_i with labels "6,7,8,9,10". Then the base BX_i of X_i has a partial downward path on the right side of X_i , as otherwise there would be no temporal path of length 10 from any of t_i^1, t_i^2, t_i^3 to s_i . For the same reason, each of the forks F^1X_i, F^2X_i has a partial downward path on the right side of X_i .

Case A-1-i. None of the forks F^1X_i , F^2X_i has a partial upward path on the left side of X_i . Then each of the forks F^1X_i , F^2X_i has a partial upward path on the right side of X_i , as otherwise there would be no temporal path of length 10 from s_i to t_i^1 or t_i^2 . For the same reason, the base BX_i has a partial upward path on the right side of X_i . Therefore we can remove the label "5" from the left bridge edge $e_i f_i^3$ of the fork F^3X_i , thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction.

Case A-1-ii. Exactly one of the forks F^1X_i , F^2X_i (say F^1X_i) has a partial upward path on the left side of X_i . Then the fork F^2X_i has a partial upward path on the right side of X_i . Furthermore the base BX_i has a partial upward path on the right side of X_i , since otherwise there would be no temporal path of length 10 from s_i to t_i^2 . In this case we can modify the solution as follows: remove the labels "1,2,3,4,5" from the partial right-upward path of BX_i and add the labels "6,7,8,9,10" to the partial left-upward path of the fork F^2X_i . Finally we

can remove the label "5" from the right bridge edge $\overline{e_i}\overline{f_i}^3$ of the fork F^3X_i , thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction.

Case A-1-iii. Each of the forks F^1X_i , F^2X_i has a partial upward path on the left side of X_i . In this case we can modify the solution as follows: remove the labels "10,9,8,7,6" from the partial right-downward path of BX_i and add the same labels "10,9,8,7,6" to the partial

⁶⁹¹ left-downward path of the base BX_i . Finally we can remove the label "5" from the right

⁶⁹² bridge edge $\overline{e_i}\overline{f_i}^3$ of the fork F^3X_i , thus obtaining a labeling with fewer labels than λ_{ϕ} , a ⁶⁹³ contradiction.

⁶⁹⁴ **Case A-2.** The base BX_i of X_i has a partial downward path on the left side of X_i ; that is, ⁶⁹⁵ there is a temporal path from vertex e_i to vertex s_i with labels "6,7,8,9,10".

Case A-2-i. None of the forks F^1X_i , F^2X_i has a partial upward path on the left side of X_i . 696 Then the base BX_i and each of the forks F^1X_i, F^2X_i have a partial upward path on the 697 right side of X_i , as otherwise there would be no temporal paths of length 10 from s_i to 698 t_1^i, t_i^2 . Moreover, as none of F^1X_i, F^2X_i has a partial left-upward path, it follows that each 699 of F^1X_i, F^2X_i has a partial downward path on the right side of X_i . Indeed, otherwise there 700 would be no temporal paths of length 10 between t_i^1 and t_i^2 . In this case we can modify the 701 solution as follows: remove the labels "1,2,3,4,5" from the partial left-upward path of BX_i 702 and add the labels "6,7,8,9,10" to the partial right-upward path of the fork F^3X_i . Finally 703 we can remove the label "6" from the left bridge edge $e_i f_i^3$ of the fork $F^3 X_i$, thus obtaining 704 a labeling with fewer labels than λ_{ϕ} , a contradiction. 705

Case A-2-ii. Exactly one of the forks F^1X_i , F^2X_i (say F^1X_i) has a partial upward path on the right side of X_i . Then the fork F^2X_i has a partial upward path on the left side of X_i . Furthermore the base BX_i must have a partial right-upward path, as otherwise there would be no temporal path from s_i to t_i^2 . In this case we can modify the solution as follows: remove the labels "1,2,3,4,5" from the partial right-upward path of BX_i and add the labels "6,7,8,9,10" to the partial left-upward path of the fork F^2X_i . Finally we can remove the label "5" from the right bridge edge $\overline{e_i} \overline{f_i}^3$ of the fork F^3X_i , thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction.

⁷¹⁴ **Case A-2-iii.** Each of the forks F^1X_i, F^2X_i has a partial upward path on the right side ⁷¹⁵ of X_i . Then we we can simply remove the label "5" from the right bridge edge $\overline{e_i}\overline{f_i}^3$ of the ⁷¹⁶ fork F^3X_i , thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction.

⁷¹⁷ **Case B.** The fork F^3X_i has also a partial upward path on the right side of X_i . That is, ⁷¹⁸ F^3X_i has partial upward-left, upward-right, downward-left, and downward-right paths.

Case B-1. The base BX_i of X_i has no partial downward path on the left side of X_i . Then the base BX_i of X_i has a partial downward path on the right side of X_i , as otherwise there would be no temporal path of length 10 from any of t_i^1, t_i^2, t_i^3 to s_i . For the same reason, each of the forks F^1X_i, F^2X_i has a partial downward path on the right side of X_i .

Note that Case B-1 is symmetric to the case where the base BX_i of X_i has no partial regardleright-downward (resp. left-upward, right upward) path.

⁷²⁵ **Case B-1-i.** None of the forks F^1X_i, F^2X_i has a partial upward path on the left side of X_i . ⁷²⁶ This case is the same as Case A-1-i.

⁷²⁷ **Case B-1-ii.** Exactly one of the forks F^1X_i , F^2X_i (say F^1X_i) has a partial upward path on ⁷²⁸ the left side of X_i . Then both the base BX_i and the fork F^2X_i has a partial right-upward ⁷²⁹ path, as otherwise there would be no temporal path of length 10 from s_i to t_i^2 . In this case, ⁷³⁰ we can always remove the label "6" from the left bridge edge $e_i f_i^3$ of the fork F^3X_i (without ⁷³¹ compromising the temporal connectivity), thus obtaining a labeling with fewer labels than

```
_{732} \lambda_{\phi}, a contradiction.
```

⁷³³ **Case B-1-iii.** Each of the forks F^1X_i , F^2X_i has a partial upward path on the left side of X_i .

That is, each of F^1X_i, F^2X_i has a partial left-upward and a partial right-downward path.

735 The following subcases can occur:

⁷³⁶ Case B-1-iii(a). None of the forks F^1X_i, F^2X_i has a partial right-upward path. Then ⁷³⁷ each of the forks F^1X_i, F^2X_i has a partial left-downward path, since otherwise there would

not exist temporal paths of length 10 between t_i^1 and t_i^2 . Furthermore, the base BX_i has a

partial left-upward path, since otherwise there would not exist a temporal path of length 10 739 from s_i to t_i^1 and t_i^2 . In this case, we can remove the label "6" from the right bridge edge 740 $\overline{e_i f_i}^3$ of the fork $F^3 X_i$, thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction. 741 **Case B-1-iii(b).** Exactly one of the forks F^1X_i , F^2X_i (say F^1X_i) has a partial right-upward 742 path. Then the base BX_i has a partial left-upward path, since otherwise there would not 743 exist a temporal path of length 10 from s_i to t_i^2 . Similarly, the fork F^1X_i has a partial 744 left-downward path, since otherwise there would not exist a temporal path of length 10 745 from t_i^1 to t_i^2 . In this case we can modify the solution as follows: First, remove the labels 746 "10,9,8,7,6" from the partial right-downward path of BX_i and add the labels "10,9,8,7,6" to 747 the partial left-downward path of BX_i . Second, remove the labels "5,6" from each of t two right bridge edges $\overline{e_i}\overline{f_i}^1$ and $\overline{e_i}\overline{f_i}^3$ of the forks F^1X_i and F^3X_i , respectively. Third, remove the label "5" from the right bridge edge $\overline{e_i}\overline{f_i}^1$ of the fork F^2X_i . Finally, add the five labels 748 749 750 "5,4,3,2,1" to the partial left-downward path of the fork F^2X_i . The resulting labeling λ_{ϕ}^* still 751 preserves the temporal reachabilities and has the same number of labels as λ_{ϕ} , while the 752 variable gadget X_i is aligned. 753

⁷⁵⁴ **Case B-1-iii(c).** Each of the forks F^1X_i , F^2X_i has a partial right-upward path. In this ⁷⁵⁵ case, we can always remove the label "5" from the left bridge edge $e_i f_i^3$ of the fork F^3X_i , ⁷⁵⁶ thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction.

Case B-2. The base BX_i of X_i has partial left-downward, right-downward, left-upward, 757 and right-upward paths. Then, due to symmetry, we may assume w.l.o.g. that the fork F^1X_i 758 has a left-upward path. Suppose that F^1X_i has also a left-downward path. In this case we 759 can modify the solution as follows: remove the labels (1,2,3,4,5) and (10,9,8,7,6) from the 760 partial right-upward and right-downward paths of BX_i and add the labels "6,7,8,9,10" and 761 "5,4,3,2,1" to the partial left-upward and left-downward paths of the fork F^2X_i . Finally we 762 can remove the label "6" from the right bridge edge $\overline{e_i}\overline{f_i}^3$ of the fork F^3X_i , thus obtaining a 763 labeling with fewer labels than λ_{ϕ} , a contradiction. 764

Finally suppose that F^1X_i has no partial left-downward path. Then F^1X_i has a partial 765 right-down path, since otherwise there would not exist any temporal path of length 10 from 766 t_i^1 to s_i . Similarly, the fork F^2X_i has a partial right-upward path, since otherwise there 767 would not exist any temporal path of length 10 from t_i^1 to t_i^2 . In this case we can modify 768 the solution as follows: First remove the labels "1,2,3,4,5" and "10,9,8,7,6" from the partial 769 left-upward and left-downward paths of BX_i . Second add the labels "6,7,8,9,10" to the 770 partial right-upward path of the fork F^1X_i and add the labels "5,4,3,2,1" to the partial 771 right-downward path of the fork F^2X_i . Finally remove the label "6" from the left bridge edge 772 $e_i f_i^3$ of the fork $F^3 X_i$, thus obtaining a labeling with fewer labels than λ_{ϕ} , a contradiction. 773

Summarizing, starting from an optimum λ_{ϕ} of G_{ϕ} , in which at least one variable gadget is 774 neither left-aligned nor right-aligned, we can modify λ_{ϕ} to another labeling λ_{ϕ}^* , such that λ_{ϕ}^* 775 has one more variable-gadget that is aligned and $|\lambda_{\phi}| = |\lambda_{\phi}^*|$. Note that this modification can 776 only happen in Case B-1-iii(b); in all other cases our case analysis arrived at a contradiction. 777 Note here that, by making the above modifications of λ_{ϕ} , we need to also appropriately modify 778 the "connecting edges" (within the variable gadgets) and the "variable edges" (between 779 different variable gadgets), without changing the total number of labels in each of these 780 edges. Finally, it is straightforward that all modifications of λ_{ϕ} can be done in polynomial 781 time. This concludes the proof. 782

Theorem 18. If $OPT_{MAL}(G_{\phi}, d_{\phi}) \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ then $OPT_{MONMAXXOR(3)}(\phi) \geq k$, where n is the number of variables in the formula ϕ .

Proof. Recall by Lemma 15 that $d_{\phi} = 10$. Let λ_{ϕ} be an optimum solution to MAL $(G_{\phi}, 10)$, which uses $\operatorname{OPT}_{MAL}(G_{\phi}, d_{\phi}) \leq \frac{13}{2}n^2 + \frac{99}{2}n - 8k$ labels by the assumption of the theorem. We will prove that there exists a truth assignment τ that satisfies at least k clauses of ϕ . Recall that, since ϕ is an instance of MONMAXXOR(3) with n variables, it has $m = \frac{3}{2}n$ clauses.

Let X_i and X_j be two variable gadgets in G_{ϕ} . First we observe that the temporal path 790 from a starting vertex s_i of X_i , to any of the ending vertices t_i^{ℓ} , where $\ell \in \{1, 2, 3\}$, must only 791 go through the vertices and edges of the variable gadget X_i . This is true since in any other 792 case the temporal path would use at least one variable edge and in this case the distance 793 of the path would increase by at least one. Therefore, the path would be of length at least 794 11, but since the diameter of the graph is 10, the largest label that is allowed to be used 795 is 10 and thus the longest temporal path can use at most 10 edges. Similarly it holds for 796 temporal paths from the ending vertices t_i^{ℓ} ($\ell \in \{1, 2, 3\}$) to the starting vertex s_i and the 797 temporal paths among the ending vertices. Even more, these temporal paths must be either 798 all on the left or all on the right side of X_i , i.e., they have to use vertices and edges that are 799 all on the left or the right side of the base BX_i and each fork $F^{\ell}X_i$. This holds as paths 800 of any other form (i.e., containing vertices and edges of both sides) are of length at least 801 11. Consequently, to label a (s_i, t_i^1) -path in both directions any labeling must use at least 802 $2 \cdot 10$ labels. Now, to label (s_i, t_i^2) and (s_i, t_i^3) -paths, the labels on the base BX_i can be 803 reused, which produces additional 10 labels on each fork F^2X_i and F^3X_i . In the case when 804 all these labels were used on the same path of the variable gadget i.e., all labels were placed 805 on the left or on the right side of BX_i and F^iX_i , there are also temporal paths connecting 806 all three ending vertices, without having to introduce any extra labels. The only missing 807 part is to assure that also all the vertices from the opposite side (i.e., if the labeling used left 808 paths, then the opposite vertices are on the right side, or vice versa) are able to reach and 809 be reached by any other vertex. Therefore, we need at least 2 more labels (one for incoming 810 and one for outgoing temporal paths) on the edges connecting them with the path (vertices) 811 on the other side. Altogether, to ensure the existence of a temporal path between any two 812 vertices from X_i , a labeling must use at least 74 labels on a variable gadget X_i . 813

Now, let X_i and X_j be such variable gadgets that do not share the fork. As observed 814 above, all vertices from each variable gadget can only be reached among each other, without 815 using the variable edges. Therefore, the variable edges must be labeled in such a way, that 816 they ensure a temporal path among vertices from different variable gadgets. W.l.o.g. we can 817 assume that X_i is left-aligned and X_j is right-aligned by λ_{ϕ} (all the other cases of aligned 818 and non-aligned labelings of X_i and X_j by λ_{ϕ} , are symmetric). Since the starting vertex 819 s_i is on the distance 10 from the ending vertices of $t_i^{\ell'}$ $(\ell' \in \{1,2,3\})$ of X_j , there must 820 be a temporal path using all labels, to connect them. This path must use the edge of the 821 form $e_i \overline{f_j}^{\ell'}$, as any other path is longer than 10. Since the path must be traversed in both 822 direction each edge $e_i \overline{f_j}^{\ell'}$ ($\ell' \in \{1, 2, 3\}$) must have at least 2 labels. Similarly it holds for 823 the (s_j, t_i^{ℓ}) -paths $(\ell \in \{1, 2, 3\})$ and the edges $\overline{e_j} f_i^{\ell}$ $(\ell \in \{1, 2, 3\})$. For a vertex s_i to reach s_j 824 we must label the edge $d_i \overline{d_j}$, as any other (s_i, s_j) -path is longer than 10. Therefore, we need 825 at least one extra label for the edge $d_i d_i$. Altogether, to ensure the existence of a temporal 826 path among two vertices from two variable gadgets that do not share a fork, a labeling must 827 use at least 13 labels on the variable edges. 828

Lastly, let X_i and X_j be two variable gadgets that share a fork. W.l.o.g. we can suppose that X_i is left-aligned by the optimum labeling λ_{ϕ} and that $F^r X_i = F^{r'} X_j$. By the construction of G_{ϕ} , there exists a temporal path to and from all the vertices in the fork $F^r X_i = F^{r'} X_j$ to all vertices in X_i and X_j , as there is a temporal path among all vertices

from X_i and a temporal path among all vertices in X_j . As observed above, these paths do 833 not use the variable edges, but the variable edges must be labeled in such a way, that they 834 ensure a temporal path among vertices from different variable gadgets. Now if we suppose 835 that the variable gadget X_j is right-aligned by the labeling λ_{ϕ} , then a temporal path between 836 s_i and s_j must use the edge $d_i d_j$ and therefore at least one extra label is used for this edge. A 837 temporal path between s_i and $t_j^{\ell'}$, where $\ell' \in \{1, 2, 3\} \setminus \{r'\}$, must use the edge $e_i \overline{f_j}^{\ell'}$. Since 838 the edge of this form is traversed in both directions it must have at least two labels. Similarly 839 it holds for the temporal paths between t_i^{ℓ} $(\ell \in \{1,2,3\} \setminus \{r\})$ and s_i . Altogether, to ensure 840 the existence of a temporal path among any two vertices from two variable gadgets that 841 share a fork, a minimum labeling must use at least 9 labels on the variable edges. Similarly 842 we can see that also all other combinations of aligned and non-aligned labelings of X_i and 843 X_j by λ_{ϕ} , require at least 9 labels on the variable edges. 844

The only thing left to study, in the case of two variable gadgets that share a fork, is what happens in the intersecting fork. By Lemma 17 we know that the variable gadgets X_i and X_j are aligned by the labeling λ_{ϕ} . Suppose that $F^T X_i = F^{T'} X_j$. W.l.o.g. we can assume that X_i is left-aligned. We distinguish the following two cases.

The variable gadget X_j is right-aligned. Then, by the construction of G_{ϕ} , the fork $F^1X_i = F^1X_j$ is labeled using the same labeling, i.e., the left labeling of the variable gadget X_i coincides with the right labeling of the variable gadget X_j . This "saves" 16 labels from the total number of labels used on variable gadgets X_i and X_j .

The variable gadget X_j is left-aligned. In this case all edges in the fork $F^1X_i = F^1X_j$ admit two labels. This "saves" 8 labels from the total number of labels used on variable gadgets X_i and X_j , since both labelings coincide on the connecting edges.

From the labeling λ_{ϕ} of G_{ϕ} we construct a truth assignment τ of ϕ in the following way. If a variable gadget X_i is left-aligned, we set x_i to TRUE and if it is right-aligned, we set x_i to FALSE. Using the results from above we deduce that the truth assignment τ satisfies at most k clauses.

Since MAL is clearly in NP, the next theorem follows directly by Theorems 14, 16, and 18.

▶ Theorem 19. MAL is NP-complete on undirected graphs, even when the required maximum
 age is equal to the diameter of the input graph.

4 The Steiner-Tree variations of the problem

In this section we investigate the computational complexity of the Steiner-Tree variations of the problem, namely MSL and MASL. First, we prove in Section 4.1 that the ageunrestricted problem MSL remains NP-hard, using a reduction from VERTEX COVER. In Section 4.2 we prove that this problem is in FPT, when parameterized by the number |R| of terminals. Finally, using a parameterized reduction from MULTICOLORED CLIQUE, we prove in Section 4.3 that the age-restricted version MASL is W[1]-hard with respect to |R|, even if the maximum allowed age is a constant.

4.1 MSL is NP-complete

▶ **Theorem 20.** MSL *is NP-complete.*

Proof. MSL is clearly contained in NP. To prove that the MSL is NP-hard we provide a
polynomial-time reduction from the NP-complete VERTEX COVER problem [25].

VERTEX COVER

Input: A static graph G = (V, E), a positive integer k. **Question:** Does there exist a subset of vertices $S \subseteq V$ such that |S| = k and $\forall e \in E, e \cap S \neq \emptyset$.

⁸⁷⁶ Let (G, k) be an input of the VERTEX COVER problem and denote |V(G)| = n, |E(G)| = m. ⁸⁷⁷ We assume w.l.o.g. that G does not admit a vertex cover of size k - 1. We construct ⁸⁷⁸ (G^*, R^*, k^*) , the input of MSL using the following procedure. The vertex set $V(G^*)$ consists ⁸⁷⁹ of the following vertices:

*** \blacksquare two starting vertices $N = \{n_0, n_1\},\$

- a "vertex-vertex" corresponding to every vertex of G: $U_V = \{u_v | v \in V(G)\},\$
- an "edge-vertex" corresponding to every edge of G: $U_E = \{u_e | e \in E(G)\},\$
- 883 $an + 12m \cdot k$ "dummy" vertices.
- ⁸⁸⁴ The edge set $E(G^*)$ consists of the following edges:
- an edge between starting vertices, i.e., $n_0 n_1$,
- a path of length 3 between a starting vertex n_1 and every vertex-vertex $u_v \in U_V$ using 2 dummy vertices, and
- for every edge $e = vw \in E(G)$ we connect the corresponding edge-vertex u_e with the vertex-vertices u_v and u_w , each with a path of length 6k + 1 using 6k dummy vertices.

We set $R^* = \{n_0\} \cup U_E$ and $k^* = 6k + 2m(6k+1) + 1$. This finishes the construction. It is not hard to see that this construction can be performed in polynomial time. For an illustration see Figure 6. Note that any two paths in G^* can intersect only in vertices from $N \cup U_V \cup U_E$ and not in any of the dummy vertices. At the end G^* is a graph with 3n + m(12k+1) + 2vertices and 1 + 3n + 2m(6k+1) edges.

We claim that (G, k) is a YES instance of the VERTEX COVER if and only if (G^*, R^*, k^*) is a YES instance of the MSL.



Figure 6 Example of a canonical layering of a directed acyclic graph (DAG).

(\Rightarrow): Assume (G, k) is a YES instance of the VERTEX COVER and let $S \subseteq V(G)$ be a vertex cover for G of size k. We construct a labeling λ for G^* that uses k^* labels and admits a temporal path between all vertices from R^* as follows.

For the sake of easier explanation we use the following terminology. A temporal path starting at n_0 and finishing at some u_e is called a *returning path*. Contrarily, a temporal path from some u_e to n_0 is called a *forwarding path*.

Let U_S be the set of corresponding vertices to S in G^* . From each edge vertex u_e there exists a path of length 6k + 1 to at least one vertex $u_v \in U_S$, since S is a vertex cover in G. We label exactly one of these paths, using labels $1, 2, \ldots, 6k + 1$. Since S is of size k,

this part uses k(6k + 1) labels. Now we label a path from each $v \in U_S$ to n_1 using labels 6k + 2, 6k + 3, 6k + 4. Each path uses 3 labels, and since S is of size k we used 3k labels for all of them. At the end we label the edge n_0n_1 with the label $\ell^* = 6k + 5$. Using this procedure we have created a forwarding path from each edge vertex u_e to the start vertex n_0 and we used 3k + m(6k + 1) + 1 labels.

To create the returning paths, we label paths from n_1 to each vertex in U_S with labels $\ell^* + 1, \ell^* + 2, \ell^* + 3$. Now again, we label exactly one path from vertices in U_S to each edge-vertex u_e , using labels $\ell^* + 4, \ell^* + 5, \ldots, \ell^* + 3 + 6k$. We used extra 3k + m(6k + 1)labels and created a returning path from n_0 to each vertex in U_E .

All together, the constructed labeling uses $k^* = 6k + 2m(6k+1) + 1$ labels, the only thing left to show is that there exists a temporal path between any pair of edge-vertices $u_e, u_f \in U_E$. It is not hard to see that this holds, as we can construct a temporal path between two edge-vertices as a union of a (sub)path of a temporal path from the first edge-vertex to the starting vertex n_0 and a (sub)path of a temporal path from the starting vertex to the other edge-vertex.

(\Leftarrow): Assume that (G^*, R^*, k^*) is a YES instance of the MSL. We construct a vertex cover of size at most k for G as follows.

Let us first observe the following, a forwarding and returning path between the starting vertex n_0 and the same edge-vertex u_e , can intersect in at most one time edge. Even more, two temporal paths between the same pair of vertices, going in the opposite directions, intersect in at most one time edge.

By the construction of G^* each (temporal) path between n_0 and a vertex in U_E passes 927 through the set U_V . Since there are m vertices in U_E and each path between a vertex $u_e \in U_E$ 928 and some $u_v \in U_V$ is of length 6k + 1, we need at least m(6k + 1) labels to connect U_E to 929 U_V in "one direction". Using the observation from above, we get that there can be at most 930 1 time edge in common between any two temporal paths among any pair of edge-vertices, 931 therefore we need at least 2m(6k+1) - 1 labels for paths in both directions. We call these 932 the forwarding path F_e (from u_e to some u_v) and the returning path R_e (from some $u_{v'}$ to 933 u_e) for u_e . It is straightforward to check that every u_e can have at most one forwarding path 934 and one returning path, since every additional path would require at least an additional 6k935 labels and then no connection between n_0 and U_V would be possible. 936

All labeled temporal paths between N and U_V can be split into two sets, one containing 937 all temporal paths that are a part of (or can be extended to) some returning path, denote 938 them P_N^+ and the others which are a part of (or can be extended to) some forwarding path, 939 denote them P_N^- . It is not hard to see that each temporal path from P_N^+ or P_N^- starts and 940 ends in $N \cup U_V$, i.e., no temporal path starts/ends in one of the dummy vertices. Therefore 941 each temporal path in P_N^+ or P_N^- uses 3 labels. Again, using the above observation we get 942 that temporal paths from P_N^+ and P_N^- share at most one label. Since this part uses at most 943 6k+1 labels, there are at most 2k temporal paths in P_N^+ and P_N^- . Suppose that $|P_N^+| \leq |P_N^-|$ 944 (the case where $|P_N^+| > |P_N^-|$ is analogous). Let $U_S \subseteq U_V$ be the set of vertices in U_V such 945 that $P_N^+ \cap U_S \neq \emptyset$, i.e., U_S consists of vertices that are endpoints of temporal paths in P_N^+ . 946 We claim that $S = \{v \mid u_v \in U_S\}$ is a vertex cover of G and $|S| \leq k$. It is not hard to see 947 that $|P_N^+| \leq k$ and therefore $|S| \leq k$. 948

We first make the following observation. We define a partial order on the set $\mathcal{P} = \{F_e, R_e \mid e \in E\}$ of forwarding and returning paths as follows. For two paths $P, Q \in \mathcal{P}$, we say that P < Q if all labels used in P are strictly smaller than the smallest label used in Q. We can assume w.l.o.g. that the defined ordering is a total ordering on \mathcal{P} since we can order incomparable path pairs arbitrarily by modifying the labels in a way that does not change

the size and the connectivity properties of the labeling. Furthermore, we can observe that for any two $e, e' \in E$ with $e \neq e'$ we have that $F_e < R_{e'}$ since in order for u_e to reach $u_{e'}$, the path F_e needs to be used before the path $R_{e'}$. It follows that there is at most one edge $e \in E$ such that $R_e < F_e$, otherwise we would reach a contradiction to the above observation.

Now assume for contradiction that S is not a vertex cover of G. Then there is an edge 958 $e = \{v, w\} \in E$ such that $\{v, w\} \cap S = \emptyset$. To reach u_e from n_0 there needs to be an edge 959 $e' = \{v, w'\}$ (or symmetrically $\{w, w'\}$) such that we can reach $u_{w'}$ from n_1 via some path 960 P, then continue to $u_{e'}$ using $R_{e'}$, then continue to u_v using $F_{e'}$, finally reach u_e using 961 R_e . Notice that this requires $P < R_{e'} < F_{e'} < R_e$. This implies that the path from n_0 to 962 u_e cannot be longer since otherwise there would be two edges e', e'' with $R_{e'} < F_{e'}$ and 963 $R_{e''} < F_{e''}$, a contradiction. It also implies that edge e is the only edge in E with $e \cap S = \emptyset$. 964 Now consider an edge $e'' = \{w', v''\} \neq e'$ such that there is no direct path from n_0 to 965 $u_{v''}$. If such an edge does not exist then w' and all of its neighbors, different than v, are in 966 S. Hence we can remove w' from S and add v to S to obtain a vertex cover for G of size at 967 most k. Assume that edge e'' with the described properties exists and consider the temporal 968 path from $u_{e'}$ to $u_{e''}$. This path must start with $F_{e'}$ thus reaching u_v . From there the path 969 cannot continue to some $u_{e''}$ since for all $e''' \neq e'$ we have that $F_{e'''} < R_{e'''}$ hence the path 970 cannot continue from $u_{e''}$. It follows that the path has to eventually reach n_1 continue to 971 $u_{w'}$ from there. However, recall that $P < F_{e'}$ which means that we cannot use P to reach 972 $u_{w'}$ from n_1 . Hence, there is a second temporal path P' (using the same edges as P with 973 later labels) from n_1 to $u_{w'}$ with $F_{e'} < P'$. This implies that |S| < k and we can add v to S 974 to obtain a vertex cover of size at most k for G. 975

4.2 An FPT-algorithm for MSL with respect to the number of terminals

⁹⁷⁸ In this section we provide an FPT-algorithm for MSL, parameterized by the number |R| of ⁹⁷⁹ terminals. The algorithm is based on a crucial structural property of minimum solutions for ⁹⁸⁰ MSL: there always exists a minimum labeling λ that labels the edges of a subtree of the ⁹⁸¹ input graph (where every leaf is a terminal vertex), and potentially one further edge that ⁹⁸² forms a C_4 with three edges of the subtree.

Intuitively speaking, we can use an FPT-algorithm for STEINER TREE parameterized by the number of terminals [14] to reveal a subgraph of the MSL instance that we can optimally label using Theorem 7. Since the number of terminals in the created STEINER TREE instance is larger than the number of terminals in the MSL instance by at most a constant, we obtain an FPT-algorithm for MSL parameterized by the number of terminals.

▶ Lemma 21. Let G = (V, E) be a graph, $R \subseteq V$ a set of terminals, and k be an integer such that (G, R, k) is a YES instance of MSL and (G, R, k - 1) is a NO instance of MSL. If k is odd, then there is a labeling λ of size k for G such that the edges labeled by λ form a tree, and every leaf of this tree is a vertex in R.

⁹⁹² If k is even, then there is a labeling λ of size k for G such that the edges labeled by λ ⁹⁹³ form a graph that is a tree with one additional edge that forms a C₄, and every leaf of ⁹⁹⁴ the tree is a vertex in R.

The main idea for the proof of Lemma 21 is as follows. Given a solution labeling λ , we fix one terminal r^* and then (i) we consider the minimum subtree in which r^* can reach all other terminal vertices and (ii) we consider the minimum subtree in which all other terminal vertices can reach r^* . Intuitively speaking, we want to label the smaller one of those subtrees using Theorem 7 and potentially adding an extra edge to form a C_4 ; we then argue that the

obtained labeling does not use more labels than λ . To do that, and to detect whether it is possible to add an edge to create a C_4 , we make a number of modifications to the trees until we reach a point where we can show that our solution is correct.

Proof. Assume there is a labeling λ for G that labels all edges in the subgraph H of G. We describe a procedure to transform H into a tree T by removing edges from H such that Tcan be labeled with k labels such that all vertices in R are pairwise temporally connected.

Consider a terminal vertex $r^* \in R$. Let $H_{r^*}^+$ be a minimum subgraph of H and $\lambda_{r^*}^+$ a minimum sublabeling of λ for $H_{r^*}^+$ such that r^* can temporally reach all vertices in $R \setminus \{r^*\}$ in $(H_{r^*}^+, \lambda_{r^*}^+)$. Let us first observe that $H_{r^*}^+$ is a tree where all leafs are vertices from R and $\lambda_{r^*}^+$ assigns exactly one label to every edge in $H_{r^*}^+$.

First note that all vertices in $(H_{r^*}^+, \lambda_{r^*}^+)$ are temporally reachable from r^* . If a vertex is not 1010 reachable, we can remove it, a contradiction to the minimality of $H_{r^*}^+$. Now assume that $H_{r^*}^+$ 1011 is not a tree. Then there is a vertex $v \in V(H_{r^*}^+)$ such that v is temporally reachable from r^* 1012 in (H^+_{*}, λ^+_{*}) via two temporal paths P, P' that visit different vertex sets, i.e. $V(P) \neq V(P')$. 1013 Assume w.l.o.g. that both P and P' are foremost among all temporal paths that visit the 1014 vertices in V(P) and V(P'), respectively, in the same order. Let the arrival time of P be 1015 at most the arrival time of P'. Then we can remove the last edge traversed by P' with all 1016 its labels from $(H_{r^*}^+, \lambda_{r^*}^+)$ such that afterwards r^* can still temporally reach all vertices in 1017 $R \setminus \{r^*\}$, a contradiction to the minimality of $H_{r^*}^+$. From now on, assume that $H_{r^*}^+$ is a tree. 1018 Assume that $H_{r^*}^+$ contains a leaf vertex v that is not contained in R. Then we can remove v 1019 from $(H_{r^*}^+, \lambda_{r^*}^+)$ such that afterwards r^* can still temporally reach all vertices in $R \setminus \{r^*\}$, a 1020 contradiction to the minimality of $H_{r^*}^+$. Lastly, assume that there is an edge e = uv in $H_{r^*}^+$ 1021 such that $\lambda_{r^*}^+$ assigns more than one label to e. Let v be further away from r^* than u in $H_{r^*}^+$ 1022 and let P be a foremost temporal path from r^* to v in $(H_{r^*}^+, \lambda_{r^*}^+)$ with arrival time t. Then 1023 we can remove all labels except for t from e and afterwards r^* can still temporally reach all 1024 vertices in $R \setminus \{r^*\}$, a contradiction to the minimality of $\lambda_{r^*}^+$. 1025

Let $H_{r^*}^-$ be a minimum subgraph of H and $\lambda_{r^*}^-$ a minimum sublabelling of λ for $H_{r^*}^$ such that each vertex in $R \setminus \{r^*\}$ can temporally reach r^* in $(H_{r^*}^-, \lambda_{r^*}^-)$. We can observe by analogous arguments as above that $H_{r^*}^-$ is a tree where all leafs are vertices from R and $\lambda_{r^*}^$ assigns exactly one label to every edge in $H_{r^*}^-$.

We define the following sets of edges:

- 1031 The set of edges only appearing in $H_{r^*}^+$: $E_{r^*}^+ = E(H_{r^*}^+) \setminus E(H_{r^*}^-)$.
- 1032 The set of edges only appearing in $H_{r^*}^-: E_{r^*}^- = E(H_{r^*}) \setminus E(H_{r^*}^+)$.
- 1033 The set of edges appearing in both $H_{r^*}^+$ and $H_{r^*}^-$: $E_{r^*}^{+-} = E(H_{r^*}^+) \cap E(H_{r^*}^-)$.

The set of edges appearing in both $H_{r^*}^+$ and $H_{r^*}^-$ that receive the same label from $\lambda_{r^*}^+$ and $\lambda_{r^*}^-: E_{r^*}^* = \{e \in E_{r^*}^{+-} \mid \lambda_{r^*}^+(e) = \lambda_{r^*}^-(e)\}.$

We claim that there exists a labelling λ' of size k for G such that there are two trees $H_{r^*}^+, H_{r^*}^-$ with the above described properties and $|E(H_{r^*}^+)| + |E(H_{r^*}^-)| - |E_{r^*}^*| = k - x$ for some $x \ge 0$ and

1039 $|E_{r^*}^*| \le x+1$ if k is odd, and

1030

¹⁰⁴⁰ if k is even, then $|E_{r^*}^*| \le x + 2$ and there exist two edges e^+, e^- in H that each of them, ¹⁰⁴¹ when added to $H_{r^*}^+, H_{r^*}^-$, respectively, creates a C_4 in $H_{r^*}^+, H_{r^*}^-$, respectively.

We first argue that the statement of the lemma follows from this claim. Afterwards we prove the claim. Assume that $|E_{r^*}^+| \leq |E_{r^*}^-|$ (the case where $|E_{r^*}^+| > |E_{r^*}^-|$ is analogous).

Assume that $|E_{r^*}^*| \leq x+1$. Then we clearly have

$$2|E(H_{r^*}^+)| - 1 = 2|E_{r^*}^+| + 2|E_{r^*}^{+-}| - 1 \le |E(H_{r^*}^+)| + |E(H_{r^*}^-)| - 1 = k - x + |E_{r^*}^*| - 1 \le k.$$

It follows that we can temporally label $H_{r^*}^+$ with at most k labels such that all vertices in $H_{r^*}^+$ can pairwise temporally reach each other, using the result that trees with m edges can be temporally labeled with 2m - 1 labels (see Theorem 7). Since we assume (G, R, k - 1) is a NO instance of MSL it follows that k = 2m - 1 and hence this can only happen if k is odd. Assume that $|E_{r^*}^*| \leq x + 2$ and there exist two edges e^+, e^- in H that each of them, when added to $H_{r^*}^+, H_{r^*}^-$, respectively, creates a C_4 in $H_{r^*}^+, H_{r^*}^-$, respectively. Then we clearly have

$$2|E(H_{r^*}^+) \cup \{e^+\}| - 4 = 2|E_{r^*}^+| + 2|E_{r^*}^{+-}| - 2 \le |E(H_{r^*}^+)| + |E(H_{r^*}^-)| - 2 = k - x + |E_{r^*}^*| - 2 \le k.$$

It follows that we can temporally label $H_{r^*}^+$ together with edge e^+ with at most k labels such that all vertices in $H_{r^*}^+$ with edge e^+ can pairwise temporally reach each other, using the result that graphs containing a C_4 with n vertices can be temporally labeled with 2n - 4labels (see Theorem 7). Since we assume (G, R, k - 1) is a NO instance of MSL it follows that k = 2n - 4 and hence this can only happen if k is even.

Now we prove that there exists a labeling λ' of size k for G such that there are two trees $H_{r^*}^+, H_{r^*}^-$ with the above described properties and $|E(H_{r^*}^+)| + |E(H_{r^*}^-)| - |E_{r^*}^*| = k - x$ for some $x \ge 0$ and $|E_{r^*}^*| \le x + 1$.

Let $H_{r^*}^+$, $H_{r^*}^-$ be two trees with the above described properties and $|E(H_{r^*}^+)| + |E(H_{r^*}^-)| - |E_{r^*}^+| = k - x$ for some $x \ge 0$. We will argue that by slightly modifying the labeling λ (and with that $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$, that way ultimately obtaining λ') and $H_{r^*}^+$, $H_{r^*}^-$, we achieve that $|E(H_{r^*}^+)| + |E(H_{r^*}^-)| - |E_{r^*}^*| = k - x'$ for some $x' \ge 0$ and either $|E_{r^*}^*| \le x' + 1$ or $|E_{r^*}^*| \le x' + 2$. We will argue that in the former case we must have that k is odd, and in the latter case we must have that k is even. Note that if $|E_{r^*}^*| = 1$ we are done, hence assume from now on that $|E_{r^*}^*| \ge 2$.

We consider several cases. For the sake of presentation of the next cases, define the *head* of a temporal path as the last vertex visited by the path and the *extended head* of a temporal path as the last two vertices visited by the path. Furthermore, define the *tail* of a temporal path as the first vertex visited by the path and the *extended tail* of a temporal path as the first two vertices visited by the path.

Case A. Assume there is a temporal path P from r^* to some $r \in R \setminus \{r^*\}$ in $H_{r^*}^+$ that traverses two edges in $E_{r^*}^*$. Let $e, e' \in E_{r^*}^*$ with $e \neq e'$ such that there is a temporal path Pfrom r^* to some $r \in R \setminus \{r^*\}$ in $H_{r^*}^+$ that traverses w.l.o.g. first e and then e' and a maximum number α of edges lies between them in P and the distance β between r^* and e is minimum. Note that this implies that $\lambda_{r^*}^+(e) < \lambda_{r^*}^+(e')$.

In the following we analyse several cases. In some of them we can deduce that the labeling λ must use labels that are not present in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$ that are unique to that case. This implies that for each of these cases we can attribute one label outside of $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ to edge e or e'.

In some other cases we describe modifications that do not increase $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$ and either

- 1083 **—** strictly decrease β , or
- 1084 strictly decrease α and not increase β , or
- 1085 strictly decrease $|E_{r^*}|$ and not increase α and β ,
- 1086 while preserving that
- 1087 = $H_{r^*}^+$ and $H_{r^*}^+$ are trees with leafs in R, and
- 1088 $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ assign at most one label per edge.

Whenever a modification satisfies the above requirements it is clear that it can only be applied a finite number of times. Whenever we describe a case that requires modifications that do not satisfy the above requirements, we explicitly show that these modifications can

¹⁰⁹² only be applied a finite number of times as well. Overall this then shows that after a finite ¹⁰⁹³ number of modifications, none of the described cases will apply.

We partition the temporal path P into the part P_1 from r^* to e, the part consisting of eitself, the part P_2 between e and e', the part consisting of e' itself, and the part P_3 from e'to r. Now in $H_{r^*}^-$ we can have two different scenarios. For illustrations of all variations of Case A see Figures 7–9.





(a) Case A: an example of a path P from r^* in $H_{r^*}^+$, that traverses $e, e' \in E_{r^*}^*$.



(b) Case A-1: an example of P in $H_{r^*}^+$ and P' in $H_{r^*}^-$, that share $e, e' \in E_{r^*}^*$.



(c) Case A-1-i: P^* from \hat{r}_2 to \hat{r}_1 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(e) Case A-1-ii: P^* from \hat{r}_1 to \hat{r}_2 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

(d) Modification of Case A-1-i.



(f) Modification of Case A-1-ii.

Figure 7 Cases A-1 – A-1-ii, where *blue* color corresponds to the labeling $\lambda_{r^*}^+$ and *red* to $\lambda_{r^*}^-$.

Case A-1. There is a temporal path P' from some $r' \in R \setminus \{r^*\}$ to r^* in $H_{r^*}^-$ that traverses both e and e'. Note that this implies that e is traversed before e'.

We partition the temporal path P' into the part P'_1 from r' to e, the part consisting of e'_1 itself, the part P'_2 between e and e', the part consisting of e' itself, and the part P'_3 from e'_1 to r^* .

The analysis of each one follows from the observation that the labels in P'_3 are larger than the ones in P_1 .

Case A-1-i. Assume there is a path \hat{P}_1 in $H_{r^*}^+$ starting at a vertex that is visited by P_1 and ending at $\hat{r}_1 \in R \setminus \{r^*\}$ such that $\hat{r}_1 = r'$ or \hat{P}_1 and P'_1 intersect in a vertex. For our analysis, we treat these two cases the same since in both cases we can assume that r' can reach \hat{r}_1 , in the latter through the intersection point. If there is a path \hat{P}_2 in $H_{r^*}^-$ starting at some $\hat{r}_2 \in R \setminus \{r^*, r'\}$ and ending at the extended tail of P'_2 or P'_3 , then the temporal path P^* in (G, λ) from \hat{r}_2 to \hat{r}_1 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Case A-1-ii. Assume there is a path \hat{P}_1 in $H_{r^*}^-$ starting at $\hat{r}_1 \in R \setminus \{r^*\}$ and ending at a vertex that is visited by P'_3 , such that $\hat{r}_1 = r$ or \hat{P}_1 and P_3 intersect in a vertex. Again for our analysis, we treat these two cases the same since in both cases we can assume that \hat{r}_1 can reach r, in the latter through the intersection point. If there is a path \hat{P}_2 in $H_{r^*}^+$ starting at the extended tail of P_1 or P_2 and ending at some $\hat{r}_2 \in R \setminus \{r^*, r\}$, then the temporal path P^* in (G, λ) from \hat{r}_1 to \hat{r}_2 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Assume that one of the above two applies. We assume that there is no path \hat{P}_2 in $H_{r^*}^$ starting at some $\hat{r}_2 \in R \setminus \{r^*, r'\}$ and ending at the extended tail of P'_2 or P'_3 in Case A-1-i and that there is no path \hat{P}_2 in $H_{r^*}^+$ starting at the extended tail of P_1 or P_2 and ending at some $\hat{r}_2 \in R \setminus \{r^*, r\}$, since in both cases we can directly deduce that we need labels outside of $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$. Then we modify λ in the following way without changing its connectivity properties. First, we scale all labels in λ by a factor of |V|.

The idea is first to essentially switch the roles of P'_1 and \hat{P}_1 in Case A-1-i and switch the roles of P_3 and \hat{P}_1 in Case A-1-ii. Assume Case A-1-i applies.

We remove \hat{P}_1 's edges and labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, add \hat{P}_1 's edges to $H_{r^*}^-$. Add the edges between the (original) tail of \hat{P}_1 to e to $H_{r^*}^-$ and add the respective labels for those edges from $\lambda_{r^*}^+$ also to $\lambda_{r^*}^-$. Add new labels for the edges of \hat{P}_1 to $\lambda_{r^*}^-$ such that there is temporal paths from r' to r^* that does use edges from P'_1 .

We remove P'_1 's edges and labels from $H^-_{r^*}$ and $\lambda^-_{r^*}$, respectively, add P'_1 's edges to $H^+_{r^*}$, and add new labels for the edges of P'_1 to $\lambda^+_{r^*}$ such that there is a temporal path from r^* to r'.

¹¹³² Now assume Case A-1-ii applies. We make analogous modifications.

We remove \hat{P}_1 's edges and labels from $H_{r^*}^-$ and $\lambda_{r^*}^-$, respectively, add \hat{P}_1 's edges to $H_{r^*}^+$. Add the edges from the head of \hat{P}_1 to e' to $H_{r^*}^+$ and add the respective labels for those edges from $\lambda_{r^*}^-$ also to $\lambda_{r^*}^+$. Add new labels for the edges of \hat{P}_1 to $\lambda_{r^*}^+$ such that there is temporal paths from r^* to r that does use edges from P_3 .

We remove P_3 's edges and labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, add P_3 's edges to $H_{r^*}^-$, and add new labels for the edges of P_3 to $\lambda_{r^*}^-$ such that there are temporal paths from rto r^* .

Note that after the modifications $H_{r^*}^+$ and $H_{r^*}^-$ are still trees, and $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ still assign at most one label per edge. Furthermore, we have that the modification do not increase the sum of edges in both trees $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$. Note that these modifications potentially increase $|E_{r^*}^*|$ and α . However, note that in both cases we strictly decrease β . From now on assume that Cases A-1-i and A-1-ii do not apply.

¹¹⁴⁵ We start with three further subcases. The analysis of each one follows from the observation ¹¹⁴⁶ that the labels in P'_3 are larger than the ones in P_1 .

Case A-1-iii. Assume there is a path \hat{P} in $H_{r^*}^+$ starting at a vertex that is visited by P_1 but is different from its tail and extended head and ending at some $\hat{r} \in R \setminus \{r^*, r\}$. Then the temporal path P^* in (G, λ) from r' to \hat{r} needs at least one label that is not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$. More specifically, P^* either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Case A-1-iv. Assume there is a path \hat{P} in $H_{r^*}^-$ starting at some $\hat{r} \in R \setminus \{r^*, r'\}$ and ending at a vertex that is visited by P'_3 but is different from its extended tail and head. Then the temporal path P^* in (G, λ) from \hat{r} to r needs at least one label that is not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$. More specifically, P^* either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Case A-1-v. Assume there is a path \hat{P}_1 in $H_{r^*}^+$ starting at a vertex that is visited by P_2 but is different from its tail and extended head and ending at some $\hat{r}_1 \in R \setminus \{r^*, r\}$. Furthermore, assume there is a path \hat{P}_2 in $H_{r^*}^-$ starting at some $\hat{r}_2 \in R \setminus \{r^*, r'\}$ and ending at a vertex that is visited by P'_2 but is different from its extended tail and head. Then, if $\hat{r}_2 \neq \hat{r}_1$ and $P_2 \neq P'_2$, or the starting vertex of \hat{P}_1 is by at least two edges closer to e than the starting vertex of \hat{P}_2 , the temporal path P^* in (G, λ) from \hat{r}_2 to \hat{r}_1 needs at least one label that is not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$. More specifically, P^* either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

In the above three Cases A-1-iii to A-1-v we do not make any modifications, since we can directly deduce that we need labels outside of $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$. For the remainder of this case distinction, we assume that Cases A-1-iii to A-1-v do not apply.

¹¹⁶⁵ We can further observe the following using analogous arguments as above.

Case A-1-vi. Assume there is a path \hat{P}_1 in $H_{r^*}^+$ starting at the extended head of P_1 and ending at some $\hat{r}_1 \in R \setminus \{r^*, r, r'\}$. If there is a path \hat{P}_2 in $H_{r^*}^-$ starting at some $\hat{r}_2 \in R \setminus \{r^*, r'\}$ and ending at a vertex from P'_2 that is not its tail or a vertex from P'_3 , then, if $\hat{r}_2 \neq \hat{r}_1$, the temporal path P^* in (G, λ) from \hat{r}_2 to \hat{r}_1 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Case A-1-vii. Assume there is a path \hat{P}_1 in $H_{r^*}^-$ starting at some $\hat{r}_1 \in R \setminus \{r^*, r, r'\}$ and ending at the extended tail of P'_3 . If there is a \hat{P}_2 in $H_{r^*}^+$ starting at a vertex from P_1 or a vertex from P_2 that is not its head and ending at some $\hat{r}_2 \in R \setminus \{r^*, r\}$, then, if $\hat{r}_1 \neq \hat{r}_2$, the temporal path P^* in (G, λ) from \hat{r}_1 to \hat{r}_2 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

First, assume that Case A-1-vi or Case A-1-vii or none of them apply. Then we modify λ in the following way without changing its connectivity properties. First, we scale all labels in λ by a factor of |V|.

The idea is first to essentially switch the roles of P_1 and P'_3 .

1178

We remove P_1 's edges and labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, add P_1 's edges to $H_{r^*}^-$, and add new labels for the edges of P_1 to $\lambda_{r^*}^-$ such that there are temporal paths from both endpoints of e to r^* that only use the new labels.

We remove P'_3 's edges and labels from $H^-_{r^*}$ and $\lambda^-_{r^*}$, respectively, add P'_3 's edges to $H^+_{r^*}$, and add new labels for the edges of P'_3 to $\lambda^+_{r^*}$ such that there are temporal paths from r^* to both endpoints of e that only use the new labels.

In both modification above, we assume w.l.o.g. that the smallest and the largest label assigned 1185 to an edge of P_1 by $\lambda_{r^*}^+$ before the modification are equal the smallest and the largest label, 1186 respectively, assigned to an edge of P'_3 by $\lambda_{r^*}^+$ after the modification. Symmetrically, we 1187 assume w.l.o.g. that the smallest and the largest label assigned to an edge of P'_3 by λ_{r^*} 1188 before the modification are equal the smallest and the largest label, respectively, assigned to 1189 an edge of P_1 by $\lambda_{r^*}^-$ after the modification. Note that now there is a path from r^* to r in 1190 $(H_{r^*}^+, \lambda_{r^*}^+)$ that does not use edges e and e'. Furthermore, there is a path from r' to r^* in 1191 $(H_{r^*}^-, \lambda_{r^*}^-)$ that does not use edges e and e'. 1192

Now we have to adjust labels on e, e', P_2 , and P'_2 , depending on whether Case A-1-vi, Case A-1-vii or none of them apply.

IIPS If Case A-1-vi applies, then we remove e, e', and the edges of P'_2 and their labels from $H^{-}_{r^*}$ and $\lambda^{-}_{r^*}$, respectively. Furthermore, we exchange the labels of e and e' and the edges of P_2 assigned by $\lambda^{+}_{r^*}$ in a way that there is a temporal path from r^* to \hat{r}_1 (see Case A-1-vi) in $(H^{+}_{r^*}, \lambda^{+}_{r^*})$.



(a) Case A-1-iii: P^* from r' to \hat{r} either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(c) Case A-1-v: P^* from \hat{r}_2 to \hat{r}_1 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(e) Case A-1-vii: P^* from \hat{r}_1 to \hat{r}_2 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(g) Modification of Case A-1-vii.

Figure 8 Cases A-1-iii – A-1-vii, where *blue* color corresponds to the labeling $\lambda_{r^*}^+$ and *red* to $\lambda_{r^*}^-$.



(b) Case A-1-iv: P^* from \hat{r} to r either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(d) Case A-1-vi: P^* from \hat{r}_2 to \hat{r}_1 either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(f) Modification of Case A-1-vi.



(h) Modification when none of the cases A-1-vi nor A-1-vii apply.

- II99 If Case A-1-vii applies, then we remove e, e', and the edges of P_2 and their labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively. Furthermore, we exchange the labels of e and e' and the edges of P'_2 assigned by $\lambda_{r^*}^-$ in a way that there is a temporal path from \hat{r}_1 (see Case A-1-vii) to r^* in $(H_{r^*}^-, \lambda_{r^*}^-)$.
- If none of the Cases A-1-vi and A-1-vii apply, then we remove e its labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, and we remove e' its labels from $H_{r^*}^-$ and $\lambda_{r^*}^-$, respectively. We modify the labels of P_2 assigned by $\lambda_{r^*}^+$ is a way that all terminals that were reachable from r^*
- before the modifications can now be reached via e'. We modify the labels of P'_2 assigned by $\lambda_{r^*}^-$ is a way that all terminals that could reach r^* before the modifications can now
 - reach r^* via e.

1241

Note that after the modifications $H_{r^*}^+$ and $H_{r^*}^-$ are still trees, and $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ still assign at most one label per edge. Furthermore, we have that the modification do not increase the sum of edges in both trees $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$. Lastly, and most importantly, we have that at least one of $H_{r^*}^+$ and $H_{r^*}^-$ does contain both edges e and e'. It follows that we strictly decrease $|E_{r^*}^*|$ without increasing α .

¹²¹⁴ It follows that after exhaustively performing the above modifications we have that if Case ¹²¹⁵ A-1 applies, then one of the Cases A-1-iii to A-1-v has to apply.

Case A-2. There are two temporal paths P', P'' from some $r', r'' \in R \setminus \{r^*\}$, respectively, to r^* in $H_{r^*}^-$ such that P' traverses e and P'' traverses e'. We consider several different subcases. Let e = uv and let u be the vertex that is closer to r^* in $H_{r^*}^+$. Partition P' into P'_1 from r' to e, then e, and then P'_2 from e to r^* .

¹²²⁰ Case A-2-i. Assume the head of P'_1 is v.

We remove e and its labels from $H_{r^*}^-$ and $\lambda_{r^*}^-$, respectively. To obtain a new path in $(H_{r^*}^-, \lambda_{r^*}^-)$, we traverse P'_1 , then traverse P_2 (by modifying $\lambda_{r^*}^-$ on P'_1 accordingly) which lets us reach P'' and then we traverse P'' to reach r^* .

Note that after the modifications $H_{r^*}^-$ is still a tree and $\lambda_{r^*}^-$ still assign at most one label per edge. However, the size of $E_{r^*}^*$ changes, in particular it can increase, but the maximal number α of edges between two edges from $E_{r^*}^*$ in P decreases by one.

Case A-2-ii. Assume the head of P'_1 is u. Assume there is a path \hat{P} in $H^+_{r^*}$ starting at a vertex that is visited by P_1 but is different from its tail and extended head and ending at some $\hat{r} \in R \setminus \{r^*, r\}$, such that $\hat{r} = r'$ or \hat{P} and P'_1 intersect in a vertex. For our analysis, we treat these two cases the same since in both cases we can assume that r' can reach \hat{r} , in the latter through the intersection point.

Case A-2-ii(a). Furthermore, assume there is a path \hat{P}' in $H_{r^*}^-$ starting at some $\hat{r}' \in R \setminus \{r^*, r'\}$ and ending at a vertex that is visited by P'_2 . Then the temporal path P^* in (G, λ) from \hat{r}' to r' either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Case A-2-ii(b). Furthermore, assume there is a path \hat{P}'' in $H_{r^*}^-$ starting at some $\hat{r}'' \in R \setminus \{r^*, r'\}$ and ending at a vertex that is visited by P_2'' . Then the temporal path P^* in (G, λ) from \hat{r}'' to r' either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.

Assume that Cases A-2-ii(a) and (b) do not apply. Then we modify λ in the following way without changing its connectivity properties. First, we scale all labels in λ by a factor of |V|.

The idea is to essentially switch the roles of \hat{P} and P'_2 .

- We remove P_1 's and \hat{P} 's edges and labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, add \hat{P} 's edges to $H_{r^*}^-$. Add the edges from the tail of \hat{P} to r^* to $H_{r^*}^-$ and add labels for those edges to $\lambda_{r^*}^-$ such that there is a path from r' to r^* in $(H_{r^*}^-, \lambda_{r^*}^-)$ that uses the newly added labels. We remove P_1' 's and P_2' 's edges and labels from $H_{r^*}^-$ and $\lambda_{r^*}^-$, respectively, add P_1' 's and
- P'_{2} 's edges to $H^{+}_{r^{*}}$, and add new labels for the edges of P'_{1} and P'_{2} to $\lambda^{+}_{r^{*}}$ such that there



(a) Example of Case A-2-i.



(c) Example of Case A-2-ii.



(e) Case A-2-ii(b): P^* from \hat{r}'' to r' either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.





(b) Modification of Case A-2-i.



(d) Case A-2-ii(a): P^* from \hat{r}' to r' either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



(f) Modification of Case A-2-ii when A-2-ii(a) and A-2-ii(b) do not apply.



(h) Modification of Case A-2-iii.

(g) Case A-2-iii: P^* from \hat{r}' to r either uses no labels from $\lambda_{r^*}^+$ or no from $\lambda_{r^*}^-$.



1247 is temporal path from r^* to \hat{r} in $(H_{r^*}^+, \lambda_{r^*}^+)$.

Note that after the modifications $H_{r^*}^+$ and $H_{r^*}^-$ are still trees, and $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ still assign at most one label per edge. Furthermore, we have that the modification do not increase the sum of edges in both trees $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$. Lastly, and most importantly, we have that the path from r^* to r in $H_{r^*}^+$ does not contain both edges e and e'. It follows that we decreased α .

Case A-2-iii. Assume the head of P'_1 is u. Assume there is a path \hat{P} in $H^+_{r^*}$ starting at a vertex that is visited by P_1 but is different from its tail and extended head and ending at some $\hat{r} \in R \setminus \{r^*, r, r'\}$. Then the temporal path P^* in (G, λ) from r' to \hat{r} either uses no labels from $\lambda^+_{r^*}$ or no from $\lambda^-_{r^*}$. Furthermore, assume there is a path \hat{P}' in $H^-_{r^*}$ starting at some $\hat{r}' \in R \setminus \{r^*, r'\}$ and ending at a vertex that is visited by P'_2 but is different from its extended tail and head. Then the temporal path P^* in (G, λ) from \hat{r}' to r either uses no labels from $\lambda^+_{r^*}$ or no from $\lambda^-_{r^*}$.

We again modify λ in a way that does not change its connectivity properties. First, we scale all labels in λ by a factor of |V|. We essentially switch the roles of P_1 and P'_2 .

¹²⁶² We remove P_1 's edges and labels from $H_{r^*}^+$ and $\lambda_{r^*}^+$, respectively, add P_1 's edges to $H_{r^*}^-$, ¹²⁶³ and add new labels for the edges of P_1 to $\lambda_{r^*}^-$ such that there are temporal paths from both ¹²⁶⁴ endpoints of e to r^* that only use the new labels. We remove P_2' 's edges and labels from ¹²⁶⁵ $H_{r^*}^-$ and $\lambda_{r^*}^-$, respectively, add P_2' 's edges to $H_{r^*}^+$, and add new labels for the edges of P_2' to ¹²⁶⁶ $\lambda_{r^*}^+$ such that there are temporal paths from r^* to both endpoints of e that only use the new ¹²⁶⁷ labels.

Note that now there is a path from \hat{r}' to r^* in $(H_{r^*}^-, \lambda_{r^*}^-)$ that does not use edge e. Further note that after the modifications $H_{r^*}^+$ and $H_{r^*}^-$ are still trees, and $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ still assign at most one label per edge. Furthermore, we have that the modification do not increase the sum of edges in both trees $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$. It follows that we strictly decrease $|E_{r^*}^*|$ without increasing α .

Now consider the case where we have a temporal path P from some $r \in R \setminus \{r^*\}$ to r^* in $H^-_{r^*}$ that traverses both e and e' and two temporal paths P_1, P_2 from r^* to some $r_1, r_2 \in R \setminus \{r^*\}$, respectively, in $H^+_{r^*}$ such that P_1 traverses e and P_2 traverses e'. This case is analogous to the previously discussed case.

¹²⁷⁷ From now on we assume that Case A-2 does not apply.

Case B. From now on we assume that none of the above described cases apply. This means that there is no path from r^* to some $r \in R \setminus \{r^*\}$ in $H_{r^*}^+$ that traverses both e and e' and there is no path from some $r' \in R \setminus \{r^*\}$ to r^* in $H_{r^*}^-$ that traverses both e and e'. It follows that for every $e \in E_{r^*}^*$ we have a path in $H_{r^*}^+$ from r^* to some $r \in R \setminus \{r^*\}$ that only traverses e from the edges in $E_{r^*}^*$ and we have a path in $H_{r^*}^-$ from some $r' \in R \setminus \{r^*\}$ to r^* that only traverses e from the edges in $E_{r^*}^*$. All the following cases are illustrated in Figure 10.

Case B-1. Let $e, e' \in E_{r^*}^*$ and let P_1 be a path in $H_{r^*}^+$ from r^* to some $r_1 \in R \setminus \{r^*\}$ that only traverses e from the edges in $E_{r^*}^*$ and let P_2 be a path in $H_{r^*}^-$ from some $r_2 \in R \setminus \{r^*\}$ to r^* that only traverses e from the edges in $E_{r^*}^*$. Let P_1' be a path in $H_{r^*}^+$ from r^* to some $r_1' \in R \setminus \{r^*\}$ that only traverses e' from the edges in $E_{r^*}^*$ and let P_2' be a path in $H_{r^*}^-$ from some $r_2' \in R \setminus \{r^*\}$ to r^* that only traverses e' from the edges in $E_{r^*}^*$ and let P_2' be a path in $H_{r^*}^-$ from some $r_2' \in R \setminus \{r^*\}$ to r^* that only traverses e' from the edges in $E_{r^*}^*$.

¹²⁸⁹ Consider the case where all choices of P_1, P_2, P'_1, P'_2 with the above properties we have ¹²⁹⁰ $r_1 = r'_2$ or P_1 and P'_2 intersect in a vertex after they traversed e and e', respectively. Again ¹²⁹¹ for our analysis, we treat these two cases the same since in both cases we can assume that ¹²⁹² r'_2 can reach r_1 , in the latter through the intersection point. The case where all choices of ¹²⁹³ P_1, P_2, P'_1, P'_2 with the above properties we have $r'_1 = r_2$ or P'_1 and P_2 intersect in a vertex



Figure 10 Cases B-1 – B-2, where *blue* color corresponds to the labeling $\lambda_{r^*}^+$ and *red* to $\lambda_{r^*}^-$.

 $_{1294}$ after they traversed e' and e, respectively, is symmetric.

Fix temporal paths P_1, P_2, P'_1, P'_2 with the above properties and $r_1 = r'_2$ or P_1 and P'_2 intersect in a vertex after they traversed e and e', respectively. Let \hat{P}_1 be the path segment from e to the first vertex included in P'_2 (excluding e) and let \hat{P}'_2 be the path segment from the last vertex included in P_1 to e' (excluding e').

Case B-1-i. Assume $|\hat{P}_1| \leq |\hat{P}'_2|$ (the opposite case is symmetric) and $|\hat{P}_1| + |\hat{P}'_2| \geq 3$ (not both paths are only a single edge). We remove \hat{P}'_2 's edges and e and the corresponding labels from $H^-_{r^*}$ and $\lambda^-_{r^*}$, respectively, such that there is a temporal path from r'_2 to e that uses the new labels.

Note that after the modifications $H_{r^*}^+$ and $H_{r^*}^-$ are still trees, and $\lambda_{r^*}^+$ and $\lambda_{r^*}^-$ still assign at most one label per edge. Furthermore, we have that the modification do not increase the sum of edges in both trees $|E(H_{r^*}^+) \cup E(H_{r^*}^-)|$. Lastly, and most importantly, we have that at least one of $H_{r^*}^+$ and $H_{r^*}^-$ does contain both edges e and e'.

¹³⁰⁷ Case B-1-ii. Assume $|\hat{P}_1| = |\hat{P}'_2| = 1$, that is, both paths are only a single edge \hat{e}_1 and \hat{e}_2 , ¹³⁰⁸ respectively.

1309 Case B-1-ii(a). The edges e, e', \hat{e}_1 , and \hat{e}_2 form a C_4 . Then we are in the case that k is

even. In this case we set \hat{e}_1 to be e^+ and we set \hat{e}_2 to be e^- . One of these two edges will be used to close the C_4 , depending on whether which of $H^+_{r^*}$ and $H^-_{r^*}$ has fewer edges. The edges e and e' stay in $E^*_{r^*}$ and will be the only two edges for which we cannot account a label in λ that is not present in $\lambda^+_{r^*}$ or $\lambda^-_{r^*}$. In this case we have that $|E^*_{r^*}| \leq x'+2$ is fulfilled.

If Case B-1-ii(a) never applies, then we are in the case that k is odd and we have to be able to account a label in λ that is not present in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$ for all but one edge in $E_{r^*}^*$.

Case B-1-ii(b). The edges e, e', \hat{e}_1 , and \hat{e}_2 do not form a C_4 . Let e = uv and e' = u'v' and let u and u' be the vertices closer to r^* in P_1 and P'_2 , respectively. Then this means there is either at least one edge e^* between r^* and u or between r^* and u'. Consider the case where e^* is between r^* and u and let $e^* = uu^*$ for some vertex u^* . In this case e^* is contained in $H^+_{r^*}$. The other case is symmetric. Let e^{**} be the edge between r^* and u in $H^-_{r^*}$, that is incident with u.

Note that $\lambda_{r^*}^+(e^*) < \lambda_{r^*}^+(e) < \lambda_{r^*}^-(e^{**})$. We now make the following modification. We remove label $\lambda_{r^*}^+(e^*)$ and add a new label to \hat{e}_2 in $\lambda_{r^*}^+$ that is chosen in a way that allows for a temporal path from r^* to r_1 via e' and then \hat{e}_2 .

Case B-2. Fix some $e \in E_{r^*}^*$ and let P^+ be a path in $H_{r^*}^+$ from r^* to some $r^+ \in R \setminus \{r^*\}$ that 1325 only traverses e from the edges in $E_{r^*}^*$ and let P^- be a path in $H_{r^*}^-$ from some $r^- \in \mathbb{R} \setminus \{r^*\}$ 1326 to r^* that only traverses e from the edges in $E_{r^*}^*$. For all $e_i \in E_{r^*}^* \setminus \{e\}$ let P_i^+ be a path 1327 in $H_{r^*}^+$ from r^* to some $r_i^+ \in \mathbb{R} \setminus \{r^*\}$ that only traverses e_i from the edges in $E_{r^*}^*$ and let 1328 P_i^- be a path in $H_{r^*}^-$ from some $r_i^- \in R \setminus \{r^*\}$ to r^* that only traverses e_i from the edges in 1329 $E_{r^*}^*$. Note that for all $i \neq i'$ we have that $r_i^+ \neq r_{i'}^+$ and $r_i^- \neq r_{i'}^-$. Now consider edge e_i . If 1330 $\lambda_{r^*}^+(e) \leq \lambda_{r^*}^+(e_i)$, then the temporal path in (G,λ) from r_i^- to r^+ needs at least one label 1331 that is not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$. If $\lambda_{r^*}^+(e) > \lambda_{r^*}^+(e_i)$, then the temporal path in (G, λ) 1332 from r^- to r_i^+ needs at least one label that is not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$. This implies, if 1333 Case B-1-ii(a) does not apply, that λ contains at least $|E_{r^*}^*| - 1$ labels that are not contained 1334 in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$ and hence $|E_{r^*}^*| \leq x' + 1$. If Case B-1-ii(a) applies, then λ contains at least 1335 $|E_{r^*}^*| - 2$ labels that are not contained in $\lambda_{r^*}^+$ or $\lambda_{r^*}^-$ and hence $|E_{r^*}^*| \le x' + 2$. 1336 This finishes the proof. 1337

Having Lemma 21, we can now give our algorithm for MSL. As mentioned before, it uses an FPT-algorithm for STEINER TREE parameterized by the number of terminals [14] as a subroutine. Recall the definition of STEINER TREE.

STEINER TREE

Input: A static graph G = (V, E), a subset of vertices $R \subseteq V$ and a positive integer k. Question: Is there a subtree of G that includes all the vertices of R and that contains at most k edges.

Let (G, R, k) be an instance of MSL. Note that if G is C_4 -free, then Lemma 21 immediately implies that we can use an algorithm for STEINER TREE on the same input graph G with the same terminal vertices R and check whether the resulting solution subtree has at most $k^* = \lceil (k+1)/2 \rceil$ edges. In the case where G contains C_4 s, we have to determine first whether there is a C_4 in G that can be labeled in an optimal labeling. Formally, we show the following.

 \blacktriangleright **Theorem 22.** MSL is in FPT when parameterized by the number of terminals.

Proof. Assume we have access to an algorithm \mathcal{A} for STEINER TREE that on input (G, R)outputs the size of a minimum solution, that is, an integer k such that (G, R, k) is a YES instance of STEINER TREE and (G, R, k - 1) is a NO instance of STEINER TREE.

Let (G, R, k) be an instance of MSL and let $k^* = \mathcal{A}(G, R)$. For all C_4 's in G let $k_{C_4} = \mathcal{A}(G, R \cup V(C_4))$. If there exist an C_4 in G such that $k_{C_4} = k^*$, then (G, R, k) is a YES instance of MSL if and only if $k \ge 2k^* - 2$. Otherwise (G, R, k) is a YES instance of MSL if and only if $k \ge 2k^* - 1$.

We first show correctness, then we analyse the running time.

1355

(\Leftarrow): Assume there exist a C_4 in G such that $k_{C_4} = k^*$. Then there exist a subtree 1356 of G connecting all terminal vertices and containing three edges of the C_4 . We add the 1357 missing edge of the C_4 and label the subgraph using Theorem 7. This requires $2k^* - 2$ labels 1358 and clearly afterwards all terminals can pairwise reach each other. Hence, we have that if 1359 $k \geq 2k^* - 2$, then (G, R, k) is a YES instance of MSL. Assume there is no C_4 in G such that 1360 $k_{C_4} = k^*$. Then there exist a subtree of G connecting all terminal vertices and containing 1361 k^* edges. We label this tree using Theorem 7. This requires $2k^* - 1$ labels and clearly 1362 afterwards all terminals can pairwise reach each other. Hence, we have that if $k \ge 2k^* - 1$, 1363 then (G, R, k) is a YES instance of MSL. 1364

 (\Rightarrow) : Assume that (G, R, k) is a YES instance of MSL and let $k_{opt} \leq k$ such that 1365 (G, R, k_{opt}) is a YES instance of MSL and $(G, R, k_{opt} - 1)$ is a NO instance of MSL. By 1366 Lemma 21, we have that if k_{opt} is odd, then there is a labeling λ of size k_{opt} for G such that 1367 the edges labeled by λ form a tree H, and every leaf of H is a vertex in R. It is easy to see 1368 that H is a solution for the STEINER TREE instance (G, R). Hence, $\mathcal{A}(G, R)$ outputs a lower 1369 bound k^* for the number of edges in H. Furthermore, since all leafs of H are terminals, we 1370 have that every vertex in (H, λ) can temporally reach every other vertex. By Theorem 7 we 1371 know that then λ needs $2k^* - 1$ labels. This implies that $k \ge k_{\text{opt}} \ge 2k^* - 1$. 1372

Now assume that k_{opt} is even. Then by Lemma 21 we have that there is a labeling λ of 1373 size k^* for G such that the edges labeled by λ form a graph H that is a tree H' with one 1374 additional edge that forms a C_4 , and every leaf of H' is a vertex in R. For the C_4 that is 1375 formed we have that $\mathcal{A}(G, R \cup V(C_4))$ outputs a lower bound k^* for the number of edges in 1376 H'. Note that we have $k^* \leq \mathcal{A}(G, R)$, since otherwise $2k^* - 2 > 2\mathcal{A}(G, R) - 1$, which means 1377 by Theorem 7 that $k_{opt} < 2k^* - 2$. However, since all leafs of H' are terminals, we have that 1378 every vertex in (H, λ) can temporally reach every other vertex. Hence, Theorem 7 implies 1379 that $k_{\text{opt}} \geq 2k^* - 2$. It follows that $k_{\text{opt}} < 2k^* - 2$ leads to a contradiction and we have 1380 $k \ge k_{\text{opt}} \ge 2k^* - 2.$ 1381

Running time: We can use the FPT-algorithm for STEINER TREE parameterized by the number of terminals by Dreyfus and Wagner [14] for algorithm \mathcal{A} . Note that we need to iterate over all C_4 s in G (there are at most n^4 of them). Each time we invoke $\mathcal{A}(G, R \cup V(C_4))$, we increase the number of terminals by at most four. It follows that overall we obtain an FPT running time for the number of terminals as a parameter.

4.3 Parameterized Hardness of MASL

¹³⁸⁸ Note that, since MASL generalizes both MSL and MAL, NP-hardness of MASL is already ¹³⁸⁹ implied by both Theorems 19 and 20. In this section, we prove that MASL is W[1]-hard ¹³⁹⁰ when parameterized by the number |R| of the terminals, even if the restriction *a* on the ¹³⁹¹ age is a constant. To this end, we provide a parameterized reduction from MULTICOLORED ¹³⁹² CLIQUE. This, together with Theorem 22, implies that MASL is strictly harder than MSL ¹³⁹³ (parameterized by the number |R| of terminals), unless FPT=W[1].

Theorem 23. MASL is W[1]-hard when parameterized by the number |R| of the terminals, even if the restriction a on the age is a constant.

 1396 **Proof.** To prove that the MASL is W[1]-hard when parameterized by the combination of the

¹³⁹⁷ number |R| of the terminals and the number k of labels, even if the restriction a on the age ¹³⁹⁸ is a constant, we provide a parameterized polynomial-time reduction from MULTICOLORED ¹³⁹⁹ CLIQUE parameterized by the number of colors, which is W[1]-hard [19].

Multicolored Clique

Input: A static graph G = (V, E), a positive integer k, a vertex-coloring $c : V(G) \rightarrow \{1, 2, \dots, k\}$.

Question: Does G have a clique of size k including vertices of all k colors?

Let (G, k, c) be an input of the MULTICOLORED CLIQUE problem and denote |V(G)| = n, |E(G)| = m. We construct (G^*, R^*, a^*, k^*) , the input of MASL using the following procedure. The vertex set $V(G^*)$ consists of the following vertices:

¹⁴⁰⁴ a "color-vertex" corresponding to every color of V(G): $C = \{c_i | i \in \{1, 2, ..., k\}$ a color ¹⁴⁰⁵ of $V(G)\},$

a "vertex-vertex" corresponding to every vertex of $G: U_V = \{u_v | v \in V(G)\},\$

an "edge-vertex" corresponding to every edge of $G: U_E = \{u_e | e \in E(G)\},\$

¹⁴⁰⁸ a "color-combination-vertex" corresponding to a pair of two colors of V(G): $W = \{c_{i,j} | i, j \in \{1, 2, ..., k\}, i < j$, colors of $V(G)\}$, and

 $2n + 4m + 5m + \frac{11}{8}(k^4 - 2k^3 - k^2 + 2k) + \frac{11}{2}(k^3 - 3k^2 + 2k)$ "dummy" vertices.

¹⁴¹¹ The edge set $E(G^*)$ consists of the following edges:

1416

a path of length 3 (using 2 dummy vertices) between a color-vertex c_i , corresponding to the color *i*, and every vertex-vertex $u_v \in U_V$, where *v* is of color *i* in V(G), i.e., c(v) = i, for every edge $e = vw \in E(G)$, where c(v) = i and c(w) = j, we connect the corresponding edge-vertex u_e with

- the vertex-vertices u_v and u_w , each with a path of length 3 (using 2 dummy vertices),

- the color-combination-vertex $c_{i,j}$, with a path of length 6 (using 5 dummy vertices),

¹⁴¹⁸ a path of length 12 (using 11 dummy vertices), between each pair of color-combination-¹⁴¹⁹ vertices, and

a path of length 12 (using 11 dummy vertices), between all pairs of color-vertices c_i and color-combination-vertices c_{jk} , where $i \notin \{j, k\}$, i.e., we connect the color-vertex of color *i* with all color-combination vertices of pairs of color that do not include *i*.

We set $R^* = C \cup W$ (note that $|R^*| \in O(k^2)$), $a^* = 12$ and $k^* = 6k + 6(k^2 - k) + 6(k^2 - k) + 42k^2 + 2k^2 + 2$

¹⁴²⁸ We claim that (G, k, c) is a YES instance of the MULTICOLORED CLIQUE if and only if ¹⁴²⁹ (G^*, R^*, a^*, k^*) is a YES instance of the MASL.

(\Rightarrow): Assume (G, k, c) is a YES instance of the MULTICOLORED CLIQUE. Let $S \subseteq V(G)$ be the set of vertices that form a multicolored clique in G. We construct a labeling λ for G^* that uses k^* labels, which are not larger than $a^* = 12$, and admits a temporal path between all vertices from R^* as follows.

Let U_S be the set of corresponding vertices to S in G^* . For each $v \in S$ of color i we label the three edges connecting c_i to u_v with labels 1, 2, 3, one per each edge, in order to create temporal paths starting in c_i and with labels 12, 11, 10, one per each edge, in order to create temporal paths that finish in c_i . For every edge $vw = e \in E$ with endpoints in S we label the path from both of its endpoint vertex-vertices u_v, u_w to the edge-vertex u_e with labels 4, 5, 6, one per each edge, and with labels 9, 8, 7, one per each edge. This ensures the existence of both temporal paths between c_i and c_j . More precisely, (c_i, c_j) -temporal



Figure 11 An example of the construction of the input graph for MASL. For better readability, some paths among the vertices in W and paths among $c_i \in C$ and $c_{jk} \in W$ $(i \neq j \neq k)$, are not depicted.

path (resp. (c_j, c_i) -temporal path) uses labels 1, 2, 3 to reach u_v (resp. u_w), from where it 1441 continues with 4,5,6 to u_e , then with 7,8,9 reaches u_w (resp. u_v) and finally with 10,11,12 1442 it finishes in c_i (resp. c_i). Note, since S is a multicolored clique then each vertex $v' \in S$ is of 1443 a unique color i' and all vertices in S are connected. Therefore, using the above construction 1444 for all vertices in S, vertex c_i reaches and is reached by every other color vertex c_i through 1445 the vertex-vertex u_v . Even more, since there is an edge e connecting any two vertices 1446 $v, w \in S$, there is a unique edge vertex u_e (and consequently a unique path), that is used for 1447 both temporal paths between vertex-vertices u_v, u_w and their corresponding color-vertices. 1448 The above construction clearly produces a temporal path (of length 12) between any two 1449 color-vertices. This construction uses $2 \cdot 3$ labels between every color-vertex c_i and its unique 1450 vertex-vertex u_v , where $v \in S$ and c(c) = i, and $2 \cdot 6$ labels from each edge vertex u_e to 1451 both of its endpoint vertex-vertices, where e is an edge of the multicolored clique formed 1452 by the vertices in S. All in total we used $6k + 12\binom{k}{2} = 6k + 6(k^2 - k)$ labels, to connect all 1453 edge-vertices corresponding to edges formed by S with their endpoints vertex-vertices. 1454

Now, let c_{ij} and $c_{i'j'}$ be two arbitrary color-combination-vertices. By the construction of G^* there is a unique path of length 12 connecting them, which we label with labels $1, 2, \ldots, 12$ in both directions. This labeling uses $2 \cdot 12$ labels for each pair of color-combinationvertices, hence all together we use $24\frac{|W|(|W|-1)}{2}$ labels, since $|W| = \binom{k}{2}$ this equals to $3(k^4 - 2k^3 - k^2 + 2k)$.

Finally, let $c_{i'}$ and c_{ij} be two arbitrary color and color-combination-vertices, respectively. 1460 In the case when $i' \notin \{i, j\}$ there is a unique path of length 12 in G^* between them (that 1461 uses only the dummy vertices). We label this path with labels $1, 2, \ldots, 12$ in both directions. 1462 This procedure uses $2 \cdot 12$ labels for each pair of such vertices, hence all together we use 1463 $24k\binom{k-1}{2}$ labels, which equals to $12(k^3 - 3k^2 + 2k)$. In the case when $i' \in \{i, j\}$ (w.l.o.g. 1464 i'=i) we connect the vertices using the following path. In S exists a unique vertex of color 1465 i, denote it v. By the definition of S there is also vertex w of color j, which is connected 1466 to v with some edge, denote it e. Therefore, to obtain a (c_i, c_{ij}) -temporal path, we first 1467 reach u_v from c_i with labels 1, 2, 3, then continue to u_e , using labels 4, 5, 6, from where we 1468 continue to $c_{i,j}$ using the labels 7, 8, ..., 12. The (c_{ij}, c_i) -temporal path uses the same edges, 1469

with labels in reversed order. This construction introduced $2 \cdot 6$ new labels on the path of length 6 between the edge-vertex u_e and the color-class-vertex c_{ij} and reused all labels on the (c_i, u_e) -temporal paths. Repeating this for every color-class-vertex we use $2 \cdot 6|W|$ new labels, since $|W| = {k \choose 2}$ this equals to $6(k^2 - k)$.

All together λ uses $6k + 6(k^2 - k) + 6(k^2 - k) + 3(k^4 - 2k^3 - k^2 + 2k) + 12(k^3 - 3k^2 + 2k)$ labels.

¹⁴⁷⁶ (\Leftarrow): Assume that (G^*, R^*, a^*, k^*) is a YES instance of the MASL and let λ be the ¹⁴⁷⁷ corresponding labeling of G^* . Before we construct a multicolored clique for G, we prove that ¹⁴⁷⁸ the distance between any two terminal vertices from R^* in G^* is 12.

Case A. Let $c_i, c_j \in C$ be two arbitrary color-vertices and let e be an edge in G with endpoints of color i and j, i.e., $e = vw \in E(G)$ and c(v) = i, c(w) = j. There are two options how to reach c_j from c_i . One when the path connecting them passes through the set E and the other, when it passes through the set W.

Case A-1. If the path passes through the set E, we must first go through a vertex-vertex u_v , then we go to the edge-vertex u_e , continue to the vertex-vertex u_w and finish in c_j . Since all these vertices are connected with a path of length 3, we get that the distance of the whole (c_i, c_j) -path is 12.

¹⁴⁸⁷ **Case A-2.** If the path passes through the set W, then we must go through the color-class-¹⁴⁸⁸ vertex c_{ij} . Since the path between any color-vertex and color-class-vertex is of length 12 (we ¹⁴⁸⁹ prove this in the following paragraph), the whole (c_i, c_j) -path is of length 24.

Therefore, the shortest path connecting two color-vertices is of length 12 and must go through the appropriate edge-vertex.

¹⁴⁹² **Case B.** Let c_{ij} and $c_{i'}$ be two arbitrary vertices from the color-class-vertices and color-¹⁴⁹³ vertices. We distinguish two cases.

Case B-1. First, when $i' \notin \{i, j\}$. Then, by the construction of G^* , there exists a direct path of length 12, connecting them. Any other $(c_{i'}, c_{ij})$ -path must either go from $c_{i'}$ to some color-class-vertex $c_{i'j'}$, which is then connected with a path of length 12 to the c_{ij} , or go to one of the color-vertices and then continue to the c_{ij} . In both cases the constructed path is strictly longer than 12.

Case B-2. Second, when $i' \in \{i, j\}$. Let c(v) = i and $vw = e \in E(G)$. Then there is a path from c_i to c_{ij} that goes through the vertex-vertex u_v (using a path of length 3), continues to the edge-vertex u_e (using a path of length 3), which is connected to the color-class-vertex c_{ij} (using a path of length 6). Hence the constructed (c_i, c_{ij}) -path is of length 12. There exists also another (c_i, c_{ij}) -path, that goes through some other $c_{ij'}$ color-class-vertex, but it is longer than 12.

Case C. Let c_{ij} and $c_{i'j'}$ be two arbitrary color-class-vertices. By construction of G^* , there is a path of length 12 connecting them. Any other $(c_{ij}, c_{i'j'})$ -path, must use at least one vertex-vertex, which is on the distance 9 from the color-class-vertices (therefore the path through it would be of length at least 18), or a color-vertex, which is on the distance 12 from the color-class-vertices. In both cases the constructed path is strictly longer than 12.

It follows that the distance between any two terminal vertices in R^* is 12, hence a temporal path connecting them must use all labels from 1 to 12. Using this property we know that any labeling that admits a temporal path among all terminal vertices must definitely use all labels 1, 2, ..., 12 on the temporal paths among any two color-combination-vertices c_{ij} and $c_{i'j'}$, and among a color-vertex $c_{i'}$ and a color-combination-vertex c_{ij} , where $i' \notin \{i, j\}$. This is true as there are unique paths of length 12 among them. For these temporal paths

we must use $2 \cdot 12 \frac{|W|(|W|-1)}{2}$ labels (since $|W| = \binom{k}{2}$ this equals to $3(k^4 - 2k^3 - k^2 + 2k)$) and $2 \cdot 12k\binom{k-1}{2}$ labels (which equals to $12(k^3 - 3k^2 + 2k)$). Therefore, the labeling λ can use only $6k + 6(k^2 - k) + 6(k^2 - k)$ labels to connect all other terminals.

Let us now observe what happens with the temporal paths connecting remaining temporal 1519 vertices. To create a temporal path starting in a color-vertex c_i and ending in some other 1520 color-vertex (or color-combination-vertex), λ must label at least 3 edges, to allow c_i to reach 1521 one of its corresponding vertex-vertices u_v . Similarly it holds for a temporal path ending in 1522 c_i . Since the path connecting c_i to some other terminal is of length 12, the labels used on 1523 the temporal paths starting and ending in c_i cannot be the same. In fact the labels must 1524 be 1, 2, 3 for one direction and 12, 11, 10 for the other. Therefore, λ uses at least 6k labels 1525 on edges between vertices of C and U_V . Extending the arguing from above, for c_i to reach 1526 some (suitable) edge vertex u_e the path needs to continue from u_v to u_e and must use the 1527 labels 4,5,6 (or 9,8,7 in case of the path in the opposite direction). From u_e the path can 1528 continue to the corresponding color-combination-vertex $c_{i,j}$ where it must use the labels 1529 $7, 8, \ldots, 12$, or to the vertex-vertex corresponding to the other endpoint of e. This finishes 1530 the construction of the temporal path from a color-vertex to the color-class-vertex and the 1531 temporal paths among color-vertices. The remaining thing is to connect a color-class-vertex 1532 with its corresponding color-vertices. The temporal path must go through some edge vertex 1533 u_e , that is on the distance 6 from it, therefore the labeling must use the labels $1, 2, \ldots, 6$. 1534 From u_e the path continues to the suitable vertex-vertex and then to the color-vertex. Using 1535 the above labeling we see that λ must use at least $2 \cdot 6|W|$ labels (which equals to $6(k^2 - k)$) 1536 labels) on the edges between the color-class-vertices in W and the edge vertices in U_E and at 1537 least $2 \cdot 6\binom{k}{2}$ labels (which equals to $6(k^2 - k)$ labels) on the edges between the edge-vertices 1538 in U_E and vertex-vertices in U_V . Since all this together equals to k^* , all of the bounds are 1539 tight, i.e., labeling cannot use more labels. 1540

We still need to show that for every color-vertex c_i there exists a unique vertex-vertex u_v 1541 connected to it such that all temporal paths to and from c_i travel only through u_v . By the 1542 arguing on the number of labels used, we know that there can be at most two vertex-vertices 1543 that lie on temporal paths to or from c_i . More precisely, one that lies on every temporal 1544 path starting in c_i and the other that lies on every temporal path that finishes in c_i . Let 1545 now $u_v, u_{v'}$ be two such vertex-vertices. Suppose that u_v lies on all temporal paths that 1546 start in c_i and $u_{v'}$ on all temporal paths that end in c_i . Now let u_e be the edge-vertex 1547 on a temporal path from c_i to c_j , and let u_w be the vertex-vertex connected to c_j and u_e . 1548 Therefore the (c_i, c_j) -temporal path has the following form: it starts in c_i , uses the labels 1549 1,2,3 to reach u_v , then continues to u_e with 4,5,6, then with 7,8,9 reaches u_w and with 1550 10, 11, 12 ends in the c_i . To obtain the (c_i, c_{ij}) -teporal path we must label the edges from u_e 1551 to c_{ij} with the labels 6, 7, ..., 12, since the edge-vertex u_e is the only edge-vertex connected 1552 to the color-class-vertex c_{ij} that can be reached from c_i (if there would be another such 1553 edge-vertex, then the labeling λ would use too many labels on the edges between U_V and 1554 U_E). Now, for the color-vertex c_j to be able to reach the color-class-vertex c_{ij} , it must use 1555 the same labels between the u_e and c_{ij} (using the same reasoning as before). Therefore 1556 the path from c_i to u_e (through) u_w uses also the labels $1, 2, \ldots, 6$. But then for c_i to 1557 reach c_i the temporal path must use the vertex-vertex u_w , even more it must use the edge 1558 vertex u_e and consequently the vertex-vertex u_v , from where it would reach c_i . But this 1559 is in the contradiction with the assumption that the path from c_i to u_v uses only labels 1560 1,2,3. Therefore, every color-vertex c_i admits a unique vertex-vertex u_v that lies on all 1561 (c_i, c_i) and (c_i, c_i) -temporal paths. For the conclusion of the proof we claim that all vertices 1562 v corresponding to these unique vertex-vertices u_v of color-vertices c_i , form a multicolored 1563

clique in G. This is true as, by construction, a temporal path between two vertex-vertices u_v, u_w corresponds to the edge $vw = e \in E(G)$. Since every vertex-vertex is connected to exactly one color-vertex, this corresponds to the vertex coloring of V(G). In G^* there is a temporal path among any two color vertices, therefore the vertex-vertices used in these temporal paths can be reached among each other, which means that they really do form a multicolored clique.

Note here that, in the constructed instance of MASL in the proof of Theorem 23, the number of labels is also upper-bounded by a function of the number of colors in the instance of MULTICOLORED CLIQUE. Therefore the proof of Theorem 23 implies also the next result, which is even stronger (since in every solution of MASL the number of time-labels is lower-bounded by a function of the number |R| of terminals).

Corollary 24. MASL is W[1]-hard when parameterized by the number k of time-labels, even if the restriction a on the age is a constant.

¹⁵⁷⁷ **5** Concluding remarks

Several open questions arise from our results. As we pointed out in Lemma 4, $\kappa(C_n, d) = \Theta(n^2)$, while $\kappa(G, d) = O(n^2)$ for every graph G by Observation 3. For which graph classes \mathcal{G} do we have $\kappa(G, d) = o(n^2)$ (resp. $\kappa(G, d) = O(n)$) for every $G \in \mathcal{G}$?

As we proved in Theorem 19, MAL is NP-complete when the upper age bound is equal to 1581 the diameter d of the input graph G. In other words, it is NP-hard to compute $\kappa(G, d)$. On 1582 the other hand, $\kappa(G, 2r)$ can be easily computed in polynomial time, where r is the radius of 1583 G. Indeed, using the results of Section 2.1, it easily follows that, if G contains (resp. does 1584 not contain) a C_4 then $\kappa(G, 2r) = 2n - 4$ (resp. $\kappa(G, 2r) = 2n - 3$). For which values of an 1585 upper age bound a, where $d \leq a \leq 2r$, can $\kappa(G, a)$ computed efficiently? In particular, can 1586 $\kappa(G, d+1)$ or $\kappa(G, 2r-1)$ be computed in polynomial time for every undirected graph G? 1587 With respect to parameterized algorithmics, is MAL FPT with respect to the number k1588 of time-labels? 1589

¹⁵⁹⁰ — References

- Eleni C. Akrida, Leszek Gasieniec, George B. Mertzios, and Paul G. Spirakis. Ephemeral networks with random availability of links: The case of fast networks. *Journal of Parallel and Distributed Computing*, 87:109–120, 2016.
- Eleni C. Akrida, Leszek Gasieniec, George B. Mertzios, and Paul G. Spirakis. The complexity of optimal design of temporally connected graphs. *Theory of Computing Systems*, 61(3):907–944, 2017.
- Beleni C. Akrida, George B. Mertzios, Sotiris E. Nikoletseas, Christoforos L. Raptopoulos, Paul G. Spirakis, and Viktor Zamaraev. How fast can we reach a target vertex in stochastic temporal graphs? In *Proceedings of the 46th International Colloquium on Automata, Languages,* and Programming, (ICALP), volume 132, pages 131:1–131:14, 2019.
- 4 Eleni C. Akrida, George B. Mertzios, Paul G. Spirakis, and Viktor Zamaraev. Temporal vertex cover with a sliding time window. In *Proceedings of the 45th International Colloquium on Automata, Languages, and Programming (ICALP)*, pages 148:1–148:14, 2018.
- Paola Alimonti and Viggo Kann. Hardness of approximating problems on cubic graphs.
 In Proceedings of the 3rd Italian Conference on Algorithms and Complexity (CIAC), pages 288–298, 1997.

- Kyriakos Axiotis and Dimitris Fotakis. On the size and the approximability of minimum temporally connected subgraphs. In *Proceedings of the 43rd International Colloquium on Automata, Languages, and Programming, (ICALP)*, pages 149:1–149:14, 2016.
- Matthias Bentert, Anne-Sophie Himmel, Hendrik Molter, Marco Morik, Rolf Niedermeier,
 and René Saitenmacher. Listing all maximal k-plexes in temporal graphs. ACM Journal of
 Experimental Algorithmics, 24(1):13:1–13:27, 2019.
- ¹⁶¹³ 8 Binh-Minh Bui-Xuan, Afonso Ferreira, and Aubin Jarry. Computing shortest, fastest, and
 ¹⁶¹⁴ foremost journeys in dynamic networks. *International Journal of Foundations of Computer* ¹⁶¹⁵ Science, 14(2):267-285, 2003.
- 1616
 9 Richard T. Bumby. A problem with telephones. SIAM Journal on Algebraic and Discrete 1617 Methods, 2(1):13-18, 1981.
- Sebastian Buß, Hendrik Molter, Rolf Niedermeier, and Maciej Rymar. Algorithmic aspects of temporal betweenness. In *Proceedings of the 26th ACM SIGKDD Conference on Knowledge Discovery and Data Mining (KDD)*, pages 2084–2092, 2020.
- Arnaud Casteigts, Joseph G. Peters, and Jason Schoeters. Temporal cliques admit sparse
 spanners. Journal of Computer and System Sciences, 121:1–17, 2021.
- Argyrios Deligkas, Eduard Eiben, and George Skretas. Minimizing reachability times on temporal graphs via shifting labels. *CoRR*, abs/2112.08797, 2021. URL: https://arxiv.org/ abs/2112.08797.
- Argyrios Deligkas and Igor Potapov. Optimizing reachability sets in temporal graphs by
 delaying. In Proceedings of the 34th Conference on Artificial Intelligence (AAAI), pages
 9810–9817, 2020.
- 1629 14 S.E. Dreyfus and R.A. Wagner. The steiner problem in graphs. *Networks*, 1:195–207, 1971.
- 15 Jessica Enright, Kitty Meeks, George B. Mertzios, and Viktor Zamaraev. Deleting edges
 to restrict the size of an epidemic in temporal networks. *Journal of Computer and System Sciences*, 119:60–77, 2021.
- 16 Jessica Enright, Kitty Meeks, and Fiona Skerman. Assigning times to minimise reachability in temporal graphs. *Journal of Computer and System Sciences*, 115:169–186, 2021.
- 1635 17 Thomas Erlebach, Michael Hoffmann, and Frank Kammer. On temporal graph exploration. In
 1636 Proceedings of the 42nd International Colloquium on Automata, Languages, and Programming
 1637 (ICALP), pages 444-455, 2015.
- Thomas Erlebach and Jakob T. Spooner. Faster exploration of degree-bounded temporal graphs. In *Proceedings of the 43rd International Symposium on Mathematical Foundations of Computer Science (MFCS)*, pages 36:1–36:13, 2018.
- 19 Michael R. Fellows, Danny Hermelin, Frances Rosamond, and Stéphane Vialette. On the
 parameterized complexity of multiple-interval graph problems. *Theoretical Computer Science*,
 410(1):53-61, 2009. doi:https://doi.org/10.1016/j.tcs.2008.09.065.
- F. Göbel, J.Orestes Cerdeira, and H.J. Veldman. Label-connected graphs and the gossip
 problem. *Discrete Mathematics*, 87(1):29–40, 1991.
- Roman Haag, Hendrik Molter, Rolf Niedermeier, and Malte Renken. Feedback edge sets in temporal graphs. *Discrete Applied Mathematics*, 307:65–78, 2022.
- Thekla Hamm, Nina Klobas, George B. Mertzios, and Paul G. Spirakis. The complexity of temporal vertex cover in small-degree graphs. In *Proceedings of the 36th Conference on Artificial Intelligence (AAAI)*, 2022. To appear.
- Sandra M. Hedetniemi, Stephen T. Hedetniemi, and Arthur L. Liestman. A survey of gossiping and broadcasting in communication networks. *Networks*, 18(4):319–349, 1988.
- 1653 24 Petter Holme and Jari Saramäki. Temporal network theory, volume 2. Springer, 2019.
- Richard M. Karp. Reducibility among combinatorial problems. In *Complexity of Computer Computations*, pages 85–103. Springer, 1972.
- David Kempe, Jon M. Kleinberg, and Amit Kumar. Connectivity and inference problems for
 temporal networks. *Journal of Computer and System Sciences*, 64(4):820–842, 2002.

- Nina Klobas, George B. Mertzios, Hendrik Molter, Rolf Niedermeier, and Philipp Zschoche.
 Interference-free walks in time: Temporally disjoint paths. In *Proceedings of the 30th International Joint Conference on Artificial Intelligence (IJCAI)*, pages 4090–4096, 2021.
- George B. Mertzios, Othon Michail, Ioannis Chatzigiannakis, and Paul G. Spirakis. Temporal
 network optimization subject to connectivity constraints. In *Proceedings of the 40th Inter- national Colloquium on Automata, Languages and Programming (ICALP)*, pages 657–668,
 2013.
- George B Mertzios, Hendrik Molter, Rolf Niedermeier, Viktor Zamaraev, and Philipp Zschoche.
 Computing maximum matchings in temporal graphs. In *Proceedings of the 37th International Symposium on Theoretical Aspects of Computer Science (STACS)*, volume 154, pages 27:1–
 27:14, 2020.
- George B. Mertzios, Hendrik Molter, Malte Renken, Paul G. Spirakis, and Philipp Zschoche.
 The complexity of transitively orienting temporal graphs. In *Proceedings of the 46th International Symposium on Mathematical Foundations of Computer Science (MFCS)*, pages 75:1–75:18, 2021.
- George B. Mertzios, Hendrik Molter, and Viktor Zamaraev. Sliding window temporal graph
 Journal of Computer and System Sciences, 120:97–115, 2021.
- ¹⁶⁷⁵ 32 Othon Michail and Paul G. Spirakis. Traveling salesman problems in temporal graphs.
 ¹⁶⁷⁶ Theoretical Computer Science, 634:1–23, 2016.
- Othon Michail and Paul G. Spirakis. Elements of the theory of dynamic networks. Communications of the ACM, 61(2):72–72, January 2018.
- Hendrik Molter, Malte Renken, and Philipp Zschoche. Temporal reachability minimization:
 Delaying vs. deleting. In *Proceedings of the 46th International Symposium on Mathematical Foundations of Computer Science (MFCS '21)*, pages 76:1–76:15, 2021.
- Vincenzo Nicosia, John Tang, Cecilia Mascolo, Mirco Musolesi, Giovanni Russo, and Vito
 Latora. Graph metrics for temporal networks. In *Temporal Networks*. Springer, 2013.
- Suhas Thejaswi, Juho Lauri, and Aristides Gionis. Restless reachability in temporal graphs.
 CoRR, abs/2010.08423, 2021. URL: https://arxiv.org/abs/2010.08423.
- 1686 37 Tiphaine Viard, Matthieu Latapy, and Clémence Magnien. Computing maximal cliques in
 1687 link streams. *Theoretical Computer Science*, 609:245–252, 2016.