An FPT Algorithm for Temporal Graph Untangling

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Abstract

Several classical combinatorial problems have been considered and analysed on temporal graphs. Recently, a variant of Vertex Cover on temporal graphs, called MinTimelineCover, has been introduced to summarize timeline activities in social networks. The problem asks to cover every temporal edge while minimizing the total span of the vertices (where the span of a vertex is the length of the timestamp interval it must remain active in). While the problem has been shown to be NP-hard even in very restricted cases, its parameterized complexity has not been fully understood. The problem is known to be in FPT under the span parameter only for graphs with two timestamps, but the parameterized complexity for the general case is open. We settle this open problem by giving an FPT algorithm that is based on a combination of iterative compression and a reduction to the Digraph Pair Cut problem, a powerful problem that has received significant attention recently.

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1 Introduction

Temporal graphs are emerging as one of the main models to describe the dynamics of complex networks. They describe how relations (edges) change in a discrete time domain [12, 11], while the vertex set is not changing. The development of algorithms on temporal graphs has mostly focused on finding paths or walks and on analyzing graph connectivity [12, 20, 21, 7, 22, 8, 3, 17, 1, 5]. However, several classical problems in computer science have been recently extended to temporal graphs and one of the most relevant problems in graph theory and theoretical computer science, Vertex Cover, has been considered in this context [2, 10, 19].

In particular, here we study a variant of Vertex Cover, called Network Untangling, introduced in [19]. Network Untangling has applications in discovering event timelines and summarizing temporal networks. It considers a sequence of temporal interactions between entities (e.g. discussions between users in a social network) and aims to explain the observed interactions with few (and short) *activity intervals* of entities, such that each interaction is covered by at least one of the two entities involved (i.e. at least one of the two entities is active when an interaction between them is observed).

Network Untangling can be seen as a variant of Vertex Cover, where we search for a minimum cover of the interactions, called temporal edges. The size of this temporal vertex cover is based on the definition of *span* of a vertex, that is the length of vertex activity. In particular, the span of a vertex is defined as the difference between the maximum and minimum timestamp where the vertex is active. Hence, if a vertex is active in exactly one

timestamp, it has a span equal to 0. This models the idea that each vertex is present in the network because we know that they interacted at least once, but that sustained periods of interaction are relatively rare.

Four combinatorial formulations of Network Untangling have been defined in [19], varying the definition of vertex activity (a single interval or $h \geq 2$ intervals) and the objective function (minimization of the sum of vertex spans or minimization of the maximum vertex span). Here we consider the formulation, denoted by MinTimelineCover, where vertex activity is defined as a single interval and the objective function is the minimization of the sum of vertex spans. Hence, given a temporal graph, MinTimelineCover asks for a cover of the temporal edges that has minimum span and such that each vertex is active in one time interval.

We focus on this specific problem, since it is not known to be FPT or not, while the variant of the problem where vertex activity is defined as two intervals is known to be NP-hard when the span is equal to 0 [9]. Hence it is unlikely that this problem variant admits an FPT algorithm for parameter the span. The MinTimelineCover problem is known to be NP-hard also in very restricted cases, when each timestamp contains at most one temporal edge [4], when each vertex has at most two incident temporal edges in each timestamp and the temporal graph is defined over three timestamps [4], and when the temporal graph is defined over two timestamps [9]. MinTimelineCover is also known to be approximable within factor $O(T \log n)$, where n is the number of vertices and T is the number of timestamps of the temporal graph [6]. Note that, since the span of a vertex activity in exactly one timestamp is equal to 0, MinTimelineCover is trivially in P when the temporal graph is defined on a single timestamp, since in this case any solution of the problem has span 0. Furthermore, deciding whether there exists a solution of MinTimelineCover that has span equal to 0 can be decided in polynomial time via a reduction to 2-SAT [19].

MinTimelineCover has been considered also in the parameterized complexity framework. The definition of span leads to a problem where the algorithmic approaches applied to Vertex Cover cannot be easily extended for the parameter span of the solution. Indeed, in Vertex Cover for each edge we are sure that at least one of the endpoints must be included in the solution, thus at least one of the vertices contributes to the cost of the solution. This leads to the textbook FPT algorithm of branching over the endpoints of any edge. For MinTimelineCover, a vertex with span 0 may cover a temporal edge, as the vertex can be active only in the timestamp where the temporal edge is defined. This makes it more challenging to design FPT algorithms when the parameter is the span of the solution. In this case, MinTimelineCover is known to admit a parameterized algorithm only when the input temporal graph is defined over two timestamps [9], with a parameterized reduction to the Almost 2-SAT problem. However, the parameterized complexity of MinTimelineCover for the span parameter on general instances has been left open [9, 4]. The authors of [9] have also analyzed the parameterized complexity of the variants of Network Untangling proposed in [19], considering other parameters in addition to the span of the solution: the number of vertices of the temporal graph, the length of the time domain, and the number of intervals of vertex activity.

Our contributions. We solve the open question on the parameterized complexity of MinTimelineCover by showing that the problem is FPT in parameter k, the span of a solution, even if the number of timestamps is unbounded. Our algorithm takes time $O^*(2^{5k \log k})$, where the O^* notation hides polynomial factors. Our algorithm is divided into two phases, each using a different technique. First, given a temporal graph G, we use a variant of

iterative compression, where we start from a solution S of span at most k on a subgraph of G induced by a subset of vertices (taken across all timestamps), and then try to maintain such a solution after adding a new vertex of G to the graph under consideration. This requires us to reorganize which vertices involved in S should be in the solution or not, and in which timestamps. One challenge is that since the number of such timestamps is unbounded, there are too many ways to choose how to include or not include the vertices that are involved in S. We introduce the notion of a *feasible assignment*, which allows us to compute how the vertices in S can be reorganized (see Def. 8 for the formal definition). There are only $2^{O(k \log k)}$ ways of reorganizing the vertices in S. We try each such feasible assignments X, and we must then find a temporal cover of the whole graph G that "agrees" with X.

This leads to the second phase of the algorithm, which decides if such an agreement cover exists through a reduction to a variant of a problem called Digraph Pair Cut. In this problem, we receive a directed graph and forbidden pairs of vertices, and we must delete at most k arcs so that a specified source vertex does not reach both vertices from a forbidden pair. It is known that the problem can be solved in time $O^*(2^k)$. In this work, we need a version where the input specifies a set of deletable and undeletable arcs, which we call Constrained Digraph Pair Cut. The Digraph Pair Cut problem and its variants have played an important role in devising randomized kernels using matroids [16] and, more recently, in establishing a dichotomy in the complexity landscape of constraint satisfaction problems [13, 15]. Here, the problem is useful since it can model the implications of including a vertex in the solution or not and, in a more challenging way, allows implementing the notion of cost using our definition of span. We hope that the techniques developed for this reduction can be useful for other variants of temporal graph cover.

Overview of the algorithm. Our approach is loosely inspired by some ideas from the FPT algorithm for two timestamps, which is a reduction to Almost 2-SAT [9]. In the latter, one is given a set of clauses with at most two variables each and must delete a minimum number of clauses so that those remaining are satisfiable. We do not use Almost 2-SAT directly, but its usage for two timestamps may help understand the origins of our techniques and the relevance of our reduction to Digraph Pair Cut.

The reduction from MinTimelineCover on two timestamps to Almost 2-SAT associates each vertex v_i with a variable $x(v_i)$, which is true when one should include v_i in a temporal cover and false otherwise; each edge u_iv_i is associated with a clause $x(u_i) \vee x(v_i)$ (here, v_i represents the occurrence of vertex v at timestamp $i \in \{1, 2\}$). This corresponds to enforcing the inclusion of u_i or v_i in our vertex cover, and we can include enough copies of this clause to make it undeletable. Since our goal is to minimize the number of base vertices v with both v_1 and v_2 in the cover, we also add a clause $\neg x(v_1) \vee \neg x(v_2)$. Then there is a temporal cover of G of span at most k if and only if one can delete at most k clauses of the latter form to make all remaining clauses satisfiable.

For $T \geq 3$ timestamps, the clauses of the form $x(u_i) \vee x(v_i)$ can still be used to model the vertex cover requirements, but there seems to be no obvious way to model the span of a cover. One would need to devise a set of clauses of size two such that choosing an interval of t vertices in a cover corresponds to deleting $t - 1$ negative clauses. Our idea is to extend current FPT algorithms for Almost 2-SAT to accommodate our cost function. In [18], the authors propose an iterative compression FPT algorithm that starts from a solution that deletes $k + 1$ clauses, and modifies it into a solution with k clauses, if possible. The algorithm relies on several clever, but complicated properties of the dependency graph of the clauses (in which vertices are literals and arcs are implications implied by the clauses). This

algorithm seems difficult to adapt to our problem. To our knowledge, the only other FPT algorithm for Almost 2-SAT is that of [16]. The algorithm of [16] employs a parameterized reduction to Digraph Pair Cut. At a high level, the idea is to start from an initial guess of assignment for a well-chosen subset of variables, then to construct the dependency graph of the clauses. A certain chain of implications is enforced by our initial guess, the vertex pairs to separate correspond to contradictory literals, and deleting arcs corresponds to deleting clauses. It turns out that, with some work, we can skip the Almost 2-SAT formulation and reduce MinTimelineCover to (a variant of) Directed Pair Cut directly by borrowing some ideas from this reduction. This is not immediate though. The first challenge is that the aforementioned "well-chosen initial guess" idea cannot be used in our context, and we must develop new tools to enumerate a bounded number of initial guesses from a partial solution (which we call feasible assignment). The second challenge is that our reduction to our variant of Directed Pair Cut needs a specific gadget to enforce our cost scheme, while remaining consistent with the idea of modeling the dependency graph of the SAT instance corresponding to the vertex cover problem at hand.

Some of the proofs are omitted due to page limit.

2 Preliminaries

For an integer n, we denote $[n] = \{1, \ldots, n\}$ and for two integers i, j, we denote $[i, j] = \{i, i+1, \ldots, j-1, j\}$ (which is the empty st if $i > j$). Temporal graphs are defined over a discrete time domain $\mathcal{T}$, which is a sequence $1, 2 \ldots, T$ of timestamps. A temporal graph is also defined over a set of vertices, called *base vertices*, that do not change in the time domain and are defined in all timestamps, and are associated with *vertices*, which are base vertices defined in specific timestamps. We use subscripts to denote the timestamp to which a vertex belongs to, so, for a base vertex v and $t \in [T]$, we use v_t to denote the occurrence of v in timestamp t. A *temporal edge* connects two vertices, associated with distinct base vertices, that belong to the same timestamp.

▶ **Definition 1.** *A temporal graph $G = (V_B, E, \mathcal{T})$ consists of*

1. *A time domain $\mathcal{T} = \{1, 2 \ldots, T\}$;*
2. *A set V_B of* base vertices*; V_B has a corresponding set $V(G)$ of* vertices*, which consists of base vertices in specific timestamps, defined as follows:*

$$V(G) = \{v_t : v \in V_B \wedge t \in [T]\}.$$

3. *A set $E = E(G)$ of temporal edges, which satisfies:*

$$E \subseteq \{u_t v_t : u, v \in V_B, t \in [T] \wedge u \neq v\}.$$

For a directed (static) graph H, we denote by (u, v) an arc from vertex u to vertex v (we consider only directed static graphs, not directed temporal graphs).

Given a temporal graph $G = (V_B, E, \mathcal{T})$ and a set of base vertices $B \subseteq V_B$, we define the set $\tau(B)$ of all vertices of B across all times:

$$\tau(B) = \{v_t : v \in B \wedge t \in [T]\}.$$

If $B = \{v\}$, we may write $\tau(v)$ instead of $\tau(\{v\})$.

For a subset $W_B \subseteq V_B$ of base vertices, we denote by $G[W_B]$ the subgraph induced by $\tau(W_B)$, that is, the graph whose vertex set is $\tau(W_B)$ and whose edge set is $\{u_t v_t \in E : u_t, v_t \in \tau(W_B)\}$. We also use the notation $G - W_B = G[V_B \setminus W_B]$. Observe that $G[W_B]$ and $G - W_B$ are temporal graphs over the same time domain as G.

In order to define the problem we are interested in, we need to define the *assignment* of a set of base vertices.

▶ **Definition 2.** *Consider a temporal graph $G = (V_B, E, \mathcal{T})$ and a set $W_B \subseteq V_B$ of base vertices. An* assignment *of W_B is a subset $X \subseteq \tau(W_B)$ such that if $u_p \in X$ and $u_q \in X$, with $p, q \in [T]$, then $u_t \in X$, for each $t \in [p, q]$. For a base vertex $u \in W_B$ such that there exists $t \in [T]$ with $u_t \in X$, we denote by $\delta(u, X)$, $\Delta(u, X)$, respectively, the minimum and maximum timestamp, respectively, such that $u_{\delta(u,X)}, u_{\Delta(u,X)} \in X$. If u_t does not exist, then $\delta(u, X) = \Delta(u, X) = 0$.*

If W_B is clear from the context or not relevant, then we may say that X is an assignment, without specifying W_B. Note that, given an assignment X and a set $\tau(v)$, for some $v \in V_B$, then $X \cap \tau(v) = \{v_t : v_t \in X \wedge v_t \in \tau(v)\}$ contains vertices for v that belong to a contiguous interval of timestamps. Consider a set $I \subseteq [T]$ of timestamps. An assignment X *intersects* I if there exists $v_t \in X$ such that $t \in I$.

Now, we give the definition of *temporal cover*.

▶ **Definition 3.** *Given a temporal graph $G = (V_B, E, \mathcal{T})$ a* temporal cover *of G is an assignment X of V_B such that the following properties hold:*

1. *For each $v \in V_B$ there exists at least one $v_t \in X$, for some $t \in \mathcal{T}$.*
2. *For each $u_t v_t \in E$, with $t \in [T]$, at least one of u_t, v_t is in X.*

For a temporal cover X of G, the *span* of v in X is defined as: $sp(v, X) = \Delta(v, X) - \delta(v, X)$. Note that if a temporal cover X contains, for a base vertex $v \in V_B$, a single vertex v_t, then $sp(v, X) = 0$. The span of X, denoted by $sp(X)$, is then defined as:

$$sp(X) = \sum_{v \in V_B} sp(v, X).$$

The definition of temporal cover requires that for each base vertex at least one of its associated vertices belongs to the cover. This is not strictly necessary, since it might be possible to cover every temporal edge without this condition. However, this condition simplifies some of the definitions and proofs below. Note that if an assignment of a base vertex is not needed to cover temporal edges, we can assign the vertex to some timestamp without increasing the span.

Now, we are able to define MinTimelineCover (an example is presented in Fig. 1).

▶ **Problem 4.** (*MinTimelineCover*)
Input: *A temporal graph $G = (V_B, \mathcal{T}, E)$, an integer k.*
Question: *Does there exist a temporal cover of G of span at most k?*

A temporal cover $S \subseteq V(G)$ of span at most k will sometimes be called a *solution*. Our goal is to determine whether MinTimelineCover is FPT in parameter k.

3 An FPT Algorithm

In this section we present our FPT algorithm, which consists of two parts:

1. The iterative compression technique.
2. A reduction to the Constrained Digraph Pair Cut problem.

Before presenting the main steps of our algorithm, we present the main idea and some definitions. Recall that our parameter, that is the span of a solution of MinTimelineCover, is denoted by k.

Consider a temporal graph G and assume we have a temporal cover S of span at most k of the subgraph $G - \{w\}$, for some base vertex $w \in V_B$. The idea of the iterative compression step is, starting from S, to show how to decide in FPT time whether there

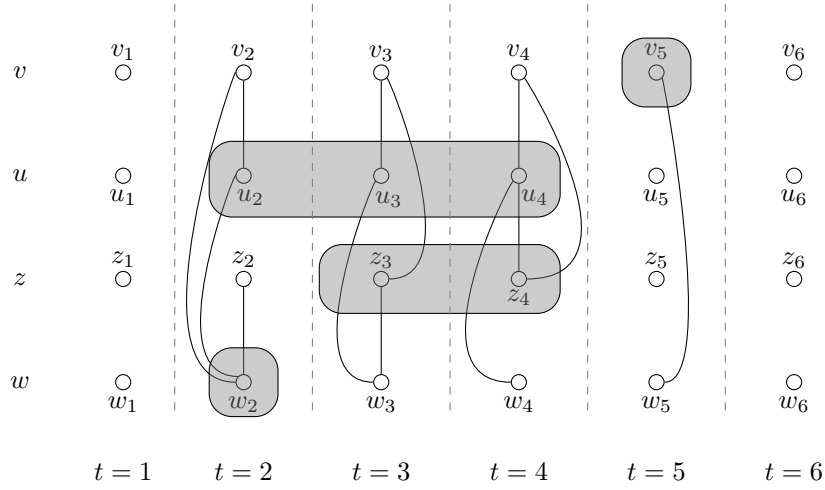

Figure 1 An example of MinTimelineCover on a temporal graph G consisting of four base vertices and six timestamps. For each timestamp, we draw the temporal edges of G, for example for $t = 2$, the temporal edges are v_2u_2, v_2w_2, u_2w_2, z_2w_2. Also note that in $t = 1$ and $t = 6$ no temporal edge is defined. A temporal cover $X = \{v_5, u_2, u_3, u_4, z_3, z_4, w_2\}$ is represented with grey rectangles. Note that $\delta(v, X) = \Delta(v, X) = 5$, $\delta(u, X) = 2$, $\Delta(u, X) = 4$, $\delta(z, X) = 3$, $\Delta(z, X) = 4$, $\delta(w, X) = \Delta(w, X) = 2$. It follows that $sp(X) = 3$.

exists a solution of MinTimelineCover for G. This is done by solving a subproblem, called Restricted Timeline Cover, where we must modify S to consider w. A solution to this subproblem is computed by branching on the assignments of base vertices having a positive span in S and on w, and then reducing the problem to Constrained Digraph Pair Cut. Restricted Timeline Cover is defined as follows.

▶ **Problem 5.** (*Restricted Timeline Cover*)

Input: *A temporal graph $G = (V_B, E, \mathcal{T})$, a vertex $w \in V_B$, an integer k, a temporal cover S of $G - \{w\}$ of span at most k.*

Output: *Does there exist a temporal cover of G of span at most k?*

For technical reasons that will become apparent later, we will assume that the temporal graph contains no edge at timestamps 1 and T, i.e. for every $u_tv_t \in E$, we have $t \in [2, T - 1]$ (as in Fig. 1). In particular, this avoids us to consider different gadget definitions in the reduction to Constrained Digraph Pair Cut, as the cases where a base vertex is assigned the first or the last of its associated vertex behaves somehow differently. It is easy to see that if this is not already the case, we can add two such "dummy" timestamps, where G does not contain any temporal edge. Indeed, since there are no temporal edges in these two timestamps, then G has a temporal cover of span at most k if and only if the same graph with dummy timestamps has a temporal cover of span at most k.

Informally, if we are able to solve Restricted Timeline Cover in FPT time, then we can obtain an FPT algorithm for MinTimelineCover as well. Indeed, we can first compute a temporal cover on a small subset of base vertices (for example a single vertex), and then we can add, one at a time, the other vertices of the graph. This requires at most $|V_B|$ iterations, and each time a vertex is added, we compute a solution of Restricted Timeline Cover to check whether it is possible to find a temporal cover of span at most k after the addition of a vertex.

Iterative Compression

We now present our approach based on iterative compression to solve the Restricted Timeline Cover problem. Given a solution S for $G - \{w\}$, we focus on the vertices of V_B that have a positive span in S and vertex w. An example of our approach, that illustrates the sets of base vertices and vertices used by the algorithm, is presented in Fig. 2.

Consider the input of Restricted Timeline Cover that consists of a temporal graph $G = (V_B, E, \mathcal{T})$, a vertex $w \in V_B$, and a temporal cover S of $G - \{w\}$ of span at most k. Define the following sets associated with S:

$$V_S = \{v \in V_B : \exists p, q \in [T], p < q, \text{ such that } v_p, v_q \in S \} \cup \{w\}$$
$$V'_S = \{v_t : v_t \in S, v \in V_S \setminus \{w\}\} \cup \{w_t : t \in [T]\}.$$

The set V_S is defined as the set of base vertices having span greater than 0 in S, plus the vertex w. V'_S contains the vertices in $V(G)$ associated with V_S, in particular: (1) the vertices corresponding to the base vertices in $V_S \setminus \{w\}$ that are included in S and (2) vertices corresponding to the base vertex w in every timestamp.

Define the following set I_S of timestamps associated with $V_S \setminus \{w\}$:

$$I_S = \{t \in [T] : u_t \in V'_S \text{ for some } u \in V_S \setminus \{w\} \}.$$

Essentially, I_S contains those timestamps where the base vertices of $V_S \setminus \{w\}$, that is of span greater than zero, have associated vertices in S. These timestamps are essential for computing a solution of Restricted Timeline Cover, that is to compute whether there exists a temporal cover of G of span at most k starting from S. We define now the sets of base vertices and vertices associated with S having a span equal to 0:

$$Z_S = V_B \setminus V_S \qquad Z'_S = S \setminus V'_S.$$

First, we show two easy properties of S and I_S on the temporal graph $G - \{w\}$.

▶ **Lemma 6.** *Let S be a solution of MinTimelineCover on instance $G - \{w\}$ and let I_S be the associated set of timestamps. Then $|I_S| \leq 2k$.*

▶ **Lemma 7.** *Let S be a solution of MinTimelineCover on instance $G - \{w\}$. Then, $sp(Z'_S) = 0$. Moreover, Z'_S covers each temporal edge of $G - \{w\}$ not covered by $V'_S \setminus \tau(w)$.*

Now, we introduce the concept of feasible assignment, which is used to "guess" how S is rearranged in a solution of Restricted Timeline Cover. Recall that an assignment X intersects a set I_S of timestamps if there exists $v_t \in X$ such that $t \in I_S$.

▶ **Definition 8** (Feasible assignment). *Consider an instance of Restricted Timeline Cover that consists of a temporal graph $G = (V_B, \mathcal{T}, E)$, a vertex $w \in V_B$, a temporal cover S of $G - \{w\}$ of span at most k, and sets V_S, V'_S and I_S associated with S. We say that an assignment $X \subseteq \tau(V_S)$ of V_S is a* feasible assignment *(with respect to G, S, and I_S) if all of the following conditions hold:*

1. *the span of X is at most k;*
2. *every edge of $G[V_S]$ is covered by X;*
3. *$X \cap \tau(w)$ is a non-empty assignment of $\{w\}$;*
4. *for every $v \in V_S \setminus \{w\}$, at least one of the following holds: (1) $X \cap \tau(v)$ is empty; (2) $X \cap \tau(v)$ is an assignment of $\{v\}$ that intersects with I_S; or (3) $X \cap \tau(v)$ contains a vertex v_t such that $v_t w_t \in E$ and $w_t \notin X \cap \tau(w)$.*

Given a feasible assignment X, we denote

$$M_S(X) = \{v \in V_S : X \cap \tau(v) \neq \emptyset\} \qquad N_S(X) = \{v \in V_S : X \cap \tau(v) = \emptyset\}$$

Informally, point 4 considers the possible cases for a feasible assignment of the vertices of a base vertex $v \in V_S \setminus \{w\}$: none of the associated vertices in I_S belongs to the computed solution (case 4.(1)); some of its associated vertices in I_S belongs to the solution (case 4.(2)); or some of the v_t vertices are forced, since they belong to an edge $v_t w_t$ with $t \in I_S$, that we know is not covered by w_t (case 4.(3)). Note that these cases are not necessarily mutually exclusive.

Note that $M_S(X)$ and $N_S(X)$ form a partition of V_S. Also note that G, S, and I_S are fixed in the remainder, so we assume that all feasible assignments are with respect to G, S, and I_S without explicit mention. We now relate feasible assignments to temporal covers.

▶ **Definition 9.** *Let X^* be a temporal cover of G and let X be a feasible assignment. We say that X^** agrees *with X if:*

- *for each $v \in M_S(X)$, $X^* \cap \tau(v) = X \cap \tau(v)$;*
- *for each $v \in N_S(X)$ and each $t \in I_S$, X^* contains every neighbor u_t of v_t such that $u_t \in \tau(Z_S)$.*

The intuition of X^* agreeing with X is as follows. For $v \in M_S(X)$, X "knows" which vertices of $\tau(v)$ should be in the solution, and we require X^* to contain exactly those. For $v \in N_S(X)$, we interpret that X does not want any vertex v_t with $t \in I_S$. Thus, to cover the edges incident to v_t that go outside of V_S, we require X^* to contain the other endpoint. Note an important subtlety: we act "as if" X^* should not contain v_t or other vertices of $N_S(X)$ with timestamp in I_S, but the definition does not forbid it. Hence, X^* *can* contain a vertex of $N_S(X)$ in some timestamps of I_S, as long as X^* contains also its neighbors (in I_S) outside V_S.

The main purpose of feasible assignments and agreement is as follows.

▶ **Lemma 10.** *Let X^* be a temporal cover of G of span at most k. Then there exists a feasible assignment X such that X^* agrees with X.*

Proof. Construct $X \subseteq X^*$ as follows: add $X^* \cap \tau(w)$ to X, and for $v \in V_S \setminus \{w\}$, add $X^* \cap \tau(v)$ to X if and only if $X^* \cap \tau(v)$ intersects with the set I_S, or if it contains a vertex v_t incident to an edge $v_t w_t \in E$ such that $w_t \notin X^* \cap \tau(w)$. Note that since X^* is an assignment of V_B, X is an assignment of V_S.

We first focus on arguing that X satisfies each condition of a feasible assignment (Definition 8). For Condition 1, since X^* has span at most k and $X \subseteq X^*$, it is clear that X also has span at most k. For Condition 3, $X^* \cap \tau(w)$ is non-empty by the definition of a temporal cover, and we added $X^* \cap \tau(w)$ to X. For Condition 4, we explicitly require in our construction of X that for each $v \in V_S \setminus \{w\}$, if $X \cap \tau(v)$ is non-empty, then it is equal to $X^* \cap \tau(v)$ and it either intersects with I_S or covers an edge not covered by $X \cap \tau(w) = X^* \cap \tau(w)$.

Let us focus on Condition 2. Let $u_t v_t \in E(G[V_S])$. If $u = w$, then if we did not add w_t to X, X^* must contain v_t and we added $X^* \cap \tau(v)$ to X, thereby covering the edge. The same holds if $v = w$. Assume $u \neq w, v \neq w$, and suppose without loss of generality that X^* contains u_t to cover the edge. Suppose for contradiction that X does not cover $u_t v_t$. Then we did not add $X^* \cap \tau(u)$ to X, which implies that $X^* \cap \tau(u)$ does not intersect with I_S. In particular, $t \notin I_S$. Recall that S, the temporal cover of $G - \{w\}$, only intersects with $\tau(u)$ and $\tau(v)$ in timestamps contained in I_S. Hence, S cannot cover $u_t v_t$, a contradiction. We deduce that X covers every edge. Therefore, X is a feasible assignment.

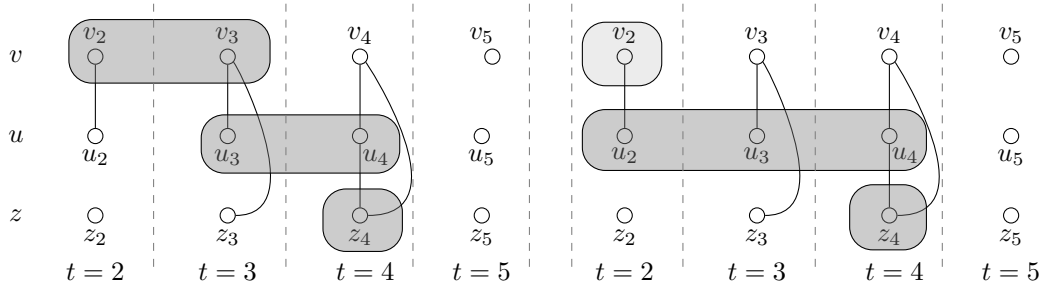

Figure 2 An example of application of iterative compression (timestamps 1 and 6 are not shown as they are edgeless, also vertex w is not shown, its assignment is defined as in Fig. 1). In the left part, we represent solution $S = \{v_2, v_3, u_3, u_4, z_4\}$, where the vertices in S are highlighted with grey rectangles. Note that $I_S = \{2, 3, 4\}$, $V_S = \{v, u\}$, $V'_S = \{v_2, v_3, u_3, u_4\}$, $Z_S = \{z\}$, $Z'_S = \{z_4\}$. In the right part, we represent in grey a feasible assignment X associated with S, containing vertices u_2, u_3, u_4; in light grey we highlight $N'_S = \{v_2\}$. The sets associated with S and X are: $M_S = \{u\}$, $N_S = \{v\}$, $N'_S = \{v_2\}$, $N''_S = \{v_2, v_3, v_4\}$. The reduction to Constrained Digraph Pair Cut eventually leads to the solution of MinTimelineCover represented in Fig. 1.

It remains to show that X^* agrees with X. For $v \in M_S(X)$, $X^* \cap \tau(v) = X \cap \tau(v)$ by the construction of X. For $v \in N_S(X)$, there is no $v_t \in X^*$ with $t \in I_S$, as otherwise we would have added $X^* \cap \tau(v)$ to X. For every such v_t, X^* must contain all of its neighbors in $\tau(Z_S)$ to cover the edges, as required by the definition of agreement. ◀

It remains to show that the number of feasible assignments has bounded size and can be enumerated efficiently. We first show the latter can be achieved through the following steps. Start with X as an empty set and then apply the following steps (checking that the overall span is at most k):

(1) Branch into every non-empty assignment X_w of $\{w\}$ of span at most k. In each branch, add the chosen subset X_w to X;
(2) For every edge $v_t w_t \in E(G[V_S])$ such that $w_t \notin X_w$, add v_t to X;
(3) For every $v \in V_S \setminus \{w\}$, such that $X \cap \tau(v) = \emptyset$ at this moment, branch into $|I_S| + 1$ options: either add no vertex of $\tau(v)$ to X, or choose a vertex v_t and add it to X, where $t \in I_S$;
(4) For every $v \in V_S \setminus \{w\}$ such that $X \cap \tau(v) \neq \emptyset$ at this moment, branch into every assignment X_v of $\{v\}$ of span at most k that contains every vertex of $X \cap \tau(v)$ (if no such assignment exists, abort the current branch). For each such branch, add every vertex of $X_v \setminus X$ to X.

▶ **Theorem 11.** *The above steps enumerate every feasible assignment in time* $O(2^{4k \log k} T^2 kn)$, *where* $n = |V_B|$.

Reducing to Constrained Digraph Pair Cut

Our objective is now to list every feasible assignment and, for each of them, to verify whether there is a temporal cover that agrees with it. More specifically, consider a feasible assignment $X \subseteq \tau(V_S)$. Our goal is to decide whether there is a temporal cover X^* of span at most k that agrees with X. Since we branch over every possible feasible assignment X, if there is a temporal cover X^* of G of span at most k, then by Theorem 11 our enumeration will eventually consider an X that X^* agrees with, and hence we will be able to decide of the existence of X^*.

We show that finding X^* reduces to the Constrained Digraph Pair Cut problem, as we define it below. For a directed graph H, we denote its set of arcs by $A(H)$ (to avoid confusion with $E(G)$, which is used for the edges of an undirected graph G). For $F \subseteq A(H)$, we write $H - F$ for the directed graph with vertex set $V(H)$ and arc set $A(H) \setminus F$.

▶ **Problem 12.** (*Constrained Digraph Pair Cut*)
Input: *A directed graph $H = (V(H), A(H))$, a source vertex $s \in V(H)$, a set of vertex pairs $P \subseteq \binom{V(H)}{2}$ called* forbidden pairs*, a subset of arcs $D \subseteq A(H)$ called* deletable arcs*, and an integer k'.*
Output: *Does there exist a set of arcs $F \subseteq D$ of H such that $|F| \leq k'$ and such that, for each $\{u, v\} \in P$, at least one of u, v is not reachable from s in $H - F$?*

It is known that Constrained Digraph Pair Cut can be solved in time $O^*(2^{k'})$ [16], but a few remarks are needed before proceeding. In [16], the authors only provide an algorithm for the *vertex-deletion* variant, and do not consider deletable/undeletable arcs. It is easy to make an arc undeletable by adding enough parallel paths between the two endpoints, and we show at the end of the section that our formulation of Constrained Digraph Pair Cut reduces to the simple vertex-deletion variant. The vertex-deletion variant also admits a randomized polynomial kernel, and other FPT results are known for weighted arc-deletion variants [14].

So let us fix a feasible assignment X for the remainder of the section. We will denote $M_S = M_S(X)$ and $N_S = N_S(X)$. We also consider the following set of vertices associated with N_S:

$$N'_S = \{v_2 : v \in N_S\} \qquad N''_S = \{v_t \in \tau(N_S) : t \in I_S\}.$$

For each base vertex $v \in N_S$, we need N'_S to contain any vertex of $\tau(v)$ that belongs to the time interval $[2, T-1]$, so we choose v_2 arbitrarily. Then, N''_S contains those vertices v_t, with $t \in I_S$, not chosen by the feasible assignment X. Note that according to our definition of agreement, a solution X^* should contain all the neighbors of N''_S vertices that are in Z_S. Recall that we have defined $Z_S = V_B \setminus V_S$ and $Z'_S = S \setminus V'_S$. By Lemma 7 we know that Z'_S covers each temporal edge of $G[V_B \setminus \{w\}]$ not covered by $S \cap V'_S$, and that $sp(Z'_S) = 0$. We may assume that for each $v \in Z_S$, there is exactly one $t \in [T]$ such that $v_t \in Z'_S$ (there cannot be more than one since Z'_S has span 0, and if there is no such t, we can add any v_t without affecting the span). Furthermore, we will assume that for each $v \in Z_S$, the vertex v_t in Z'_S is not v_1 nor v_T. Indeed, since we assume that the first and last timestamps of G have no edges, if $v_t = v_1$ or $v_t = v_T$, then v_t covers no edge and we may safely change v_p to another vertex of $\tau(v)$.

The following observation will be useful for our reduction to Constrained Digraph Pair Cut.

▶ **Observation 13.** *Let $u_t v_t \in E(G)$ such that $u \in N_S$ and $v \notin M_S$. Then $v \in Z_S$ and, if $u_t \notin N''_S$, we have $v_t \in Z'_S$.*

Now, given a feasible assignment $X \subseteq \tau(V'_S)$, sets M_S, N_S, N'_S, N''_S, Z_S, and Z'_S, we present our reduction to the Constrained Digraph Pair Cut problem. We construct an instance of this problem that consists of the directed graph $H = (V(H), A(H))$, the set of forbidden (unordered) pairs $P \subseteq \binom{V(H)}{2}$, and the deletable arcs $D \subseteq A(H)$ by applying the following steps. The second step in the construction is the most important and is shown in Figure 3. The intuition of these steps is provided afterwards.

1. add to H the source vertex s;

2. for each $v \in Z_S \cup N_S$, let v_i be the vertex of $Z'_S \cup N'_S$, where $i \in [2, T-1]$. Add to H the vertices $v_1^+, \ldots, v_{i-1}^+, v_i^-, v_{i+1}^+, \ldots, v_T^+$, the vertices $b_{v,j}, c_{v,j}, d_{v,j}$, for $j \in [T] \setminus \{i\}$, and the set of arcs shown in Figure 3, that is there are arcs $(v_j^+, b_{v,j})$, $(v_j^+, c_{v,j})$, $(c_{v,j}, d_{v,j})$, $(d_{v,j}, v_j^-)$, for each $j \in [T] \setminus \{i\}$ and four directed paths: (1) from $b_{v,i-1}$ to $b_{v,1}$, (2) from $c_{v,1}$ to $c_{v,i-1}$, (3) from $b_{v,i+1}$ to $b_{v,T}$ and (4) from $c_{v,T}$ to $c_{v,i+1}$.
   Add to D the set of deletable arcs $(c_{v,j}, d_{v,j})$, for $j \in [T] \setminus \{i\}$.
   Then add the following pairs to P:
   a. $\{d_{v,h}, b_{v,j}\}$, with $1 \leq h < j \leq i-1$;
   b. $\{d_{v,h}, b_{v,j}\}$, with $i+1 \leq j < h \leq T$;
   c. $\{c_{v,h}, d_{v,j}\}$, with $1 \leq h \leq i-1 \leq i+1 \leq j \leq T$;
   d. $\{c_{v,h}, d_{v,j}\}$, with $1 \leq j \leq i-1 \leq i+1 \leq h \leq T$.
   Note that we have created $T + 3(T-1) = 4T-3$ vertices in H in this step. The subgraph of H induced by these vertices will be called the *gadget corresponding to* v.

3. for each temporal edge $u_t v_t \in E(G)$ such that $u_t, v_t \in \tau(Z_S) \cup (\tau(N_S) \setminus N''_S)$, there are three cases. First note that at least one of u_t or v_t is in Z'_S. Indeed, if $u, v \in Z_S$, this is because an element of Z'_S must cover the temporal edge, and if $u \in N_S$, then $v_t \in Z'_S$ by Observation 13 (or if $v \in N_S, u_t \in Z'_S$). The subcases are then:
   a. if $u_t, v_t \in Z'_S \cup N'_S$, add the pair $\{u_t^-, v_t^-\}$ to P;
   b. if $u_t \in Z'_S \cup N'_S, v_t \notin Z'_S \cup N'_S$, add the arc (u_t^-, v_t^+) to H;
   c. if $v_t \in Z'_S \cup N'_S, u_t \notin Z'_S \cup N'_S$, add the arc (v_t^-, u_t^+) to H;

4. for each temporal edge $u_t v_t \in E(G)$ such that $u_t \in (\tau(M_S) \setminus X) \cup N''_S$ and $v_t \in \tau(Z_S)$, there are two cases:
   a. if $v_t \notin Z'_S$, add the arc (s, v_t^+) to H;
   b. if $v_t \in Z'_S$, add the pair $\{s, v_t^-\}$ to P.

Define $k' = k - sp(X)$. This concludes the construction. We will refer to the elements 1, 2, 3, 4 of the above enumeration as the *Steps* of the construction. Note that the only deletable arcs in D are the arcs $(c_{v,j}, d_{v,j})$ introduced in Step 2.

From here, the interpretation of H is that if we delete arc set F, then

(p1) For $v_t \notin Z'_S \cup N'_S$ we should include v_t in X^* if and only if s reaches v_t^+ in $H - F$;

(p2) For $v_t \in Z'_S \cup N'_S$ we should include v_t in X^* if and only if s does *not* reach v_t^- in $H - F$.

The idea behind the steps of the construction is then as follows (and is somewhat easier to describe in the reverse order of steps). Step 4 describes an initial set of vertices that s is forced to reach, which correspond to vertices that are forced in X^*. A vertex v_t in $\tau(Z_S)$ is forced in X^* if there is in an edge $u_t v_t$ and $u_t \in \tau(M_S)$ but $u_t \notin X$. By our definition of agreement, v_t is also forced if $u_t \in N''_S$. Step 4 handles both situations: if $v_t \notin Z'_S$, we force s to reach v_t^+ with the arc (s, v_t^+), which is not deletable. If $v_t \in Z'_S$, then $v_t^- \in V(H)$, and s is forced to *not* reach v_t^- by adding $\{s, v_t^-\}$ to P. By (p1) and (p2), both cases correspond to including v_t in X^*. Then, Step 3 ensures that each temporal edge is "covered": for a temporal edge $u_t v_t$, a pair of the form $\{u_t^-, v_t^-\}$ in P requires that s does not reach one of the two, i.e. that we include one in X^*, and an undeletable arc of the form (u_t^-, v_t^+) enforces that if s reaches u_t^- (i.e. $u_t \notin X^*$), then s reaches v_t^+ (i.e. $v_t \in X^*$). The reason why Z'_S is needed in our construction is that each edge has at least one negative corresponding vertex, so that no other case needs to be considered in Step 3.

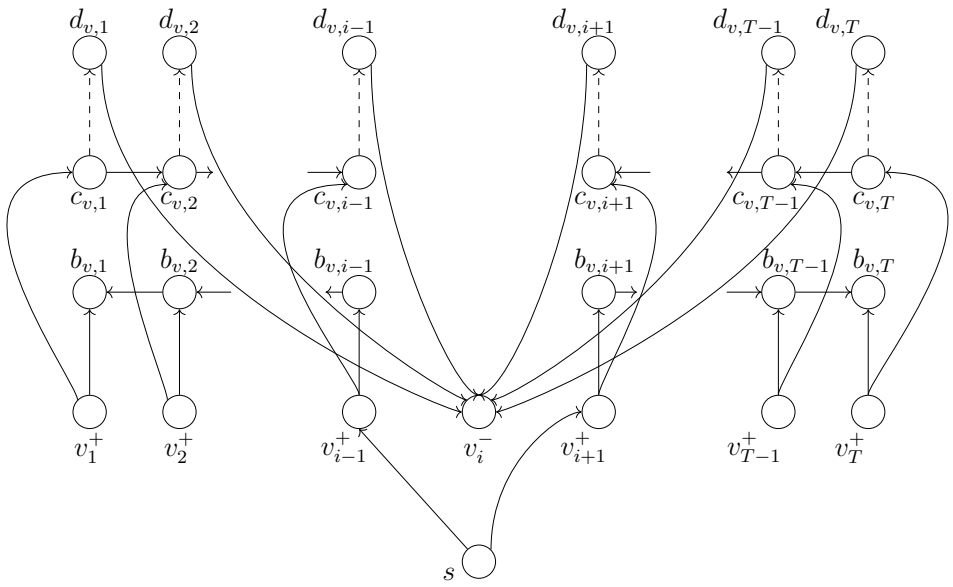

Figure 3 Gadget for $v_i \in Z'_S \cup N'_S$, where $i \in [2, T-1]$. We assume that there exist temporal edges $u_t v_t \in E(G)$, where $t \in \{i-1, i+1\}$, such that $u_t \in (\tau(M_S) \setminus X) \cup N''_S$, $v_t \in \tau(Z_S)$ and $v_t \notin Z'_S$, thus arcs from s to v_t^+ are added.The dashed arcs represent deletable arcs.

Finally, Step 2 enforces the number of deleted arcs to correspond to the span of a solution. That is, it ensures that if we want to add to X^* a set of h vertices of base vertex $v \in Z_S$ to our solution of Restricted Timeline Cover (so with a span equal to $h-1$), then we have to delete $h-1$ deletable arcs of the corresponding gadget of H in order to obtain a solution to Constrained Digraph Pair Cut (and vice-versa). Indeed, consider the gadget in Fig. 3. If v_i is not included in X^*, then in the gadget s reaches h positive vertices $v_l^+, \ldots, v_r^+$ (and v_i^-). It follows that vertices $b_{v,l}, \ldots, b_{v,r}$, $c_{v,l}, \ldots, c_{v,r}$ and $d_{v,l}, \ldots, d_{v,r}$ are all reachable from s. The pairs $\{d_{v,x}, b_{v,y}\}$ defined at Step 2, where either $l \leq x \leq y \leq r-1$ if $r < i$, or $l+1 \leq x \leq y \leq r$ if $l > i$, ensures that arcs $(c_{v,j}, d_{v,j})$, with $j \in [l, r-1]$ in the former case or with $j \in [l+1, r]$ in the latter case, are deleted.

If v_i is included in X^*, then in the gadget s reaches $h-1$ positive vertices $v_l^+, \ldots, v_r^+$, with $i \in [l, r]$, and must not reach negative vertex v_i^-. It follows that vertices $b_{v,l}, \ldots, b_{v,r}$, $c_{v,l}, \ldots, c_{v,r}$ and $d_{v,l}, \ldots, d_{v,r}$ are all reachable from s. Then $h-1$ arcs $(c_{v,j}, d_{v,j})$, with $j \in [l, r] \setminus \{i\}$, must be deleted, due to the pairs $\{d_{v,x}, b_{v,y}\}$, $\{c_{v,x}, d_{v,y}\}$ defined at Step 2.

Note that Step 2 is the reason we added dummy timestamps 1 and T. If v_1 or v_T were allowed to be in $Z'_S \cup N'_S$, we would need a different gadget for these cases.

▶ **Lemma 14.** *There exists a solution of Restricted Timeline Cover that agrees with X if and only if there is $F \subseteq D$ with $|F| \leq k'$ such that s does not reach a forbidden pair in $H - F$. Moreover, given such a set F, a solution of Restricted Timeline Cover can be computed in polynomial time.*

Sketch of the proof. ($\Rightarrow$) Suppose that there exists a solution X^* of Restricted Timeline Cover that agrees with X. By definition of Restricted Timeline Cover, X^* has span at most k. Note that for $v \in M_S$, the agreement requires that $X^* \cap \tau(v) = X \cap \tau(v)$, and so the span of v in X^* is the same as the span of v in X. Thus

$$\sum_{v \in Z_S \cup N_S} sp(v, X^*) \leq k - sp(X) = k'.$$

We may assume that for every $v \in V_B$, at least one of $v_2, \ldots, v_{T-1}$ is in X^*, as otherwise we add one arbitrarily without affecting the span (if only v_1 or v_T is in X^*, remove it first). For each $v \in Z_S \cup N_S$, consider the gadget corresponding to v in H and delete some of its dashed arcs as follows (we recommend referring to Figure 3).

First, if only one of $\tau(v)$ is in X^*, no action is required on the gadget. So assume that $X^* \cap \tau(v)$ has at least two vertices; in the following we denote $v_l = v_{\delta(v,X^*)}$ and $v_r = v_{\Delta(v,X^*)}$ the vertices associated with v having minimum and maximum timestamp, respectively, contained in X^*. We assume that $l, r \in [2, T-1]$ and $l < r$. Note that $X^* \cap \tau(v) = \{v_l, v_{l+1}, \ldots, v_r\}$.

Let $v_i \in Z'_S \cup N'_S$, where $i \in [2, T-1]$. Then

- suppose that $l, r \in [2, i-1]$, then: delete every arc $(c_{v,q}, d_{v,q})$, with $l \leq q \leq r-1$
- suppose that with $l, r \in [i+1, T-1]$, then: delete every arc $(c_{v,q}, d_{v,q})$, with $l+1 \leq q \leq r$
- suppose that $l \in [2, i]$ and $r \in [i, T-1]$, then: delete every arc $(c_{v,q}, d_{v,q})$, with $l \leq q \leq i-1$, and delete every arc $(c_{v,q}, d_{v,q})$, with $i+1 \leq q \leq r$.

We see that by construction for all $v \in Z_S \cup N_S$, the number of arcs deleted in the gadget corresponding to v is equal to the number of vertices in $X^* \cap \tau(v)$ minus one, that is the span of v in X^*. Since these vertices have span at most k', it follows that we deleted at most k' arcs from H. Denote by H' the graph obtained after deleting the aforementioned arcs. We argue that in H', s does not reach a forbidden pair. To this end, we claim the following.

▷ Claim 15. For $v \in Z_S \cup N_S$ and $t \in [T]$, if s reaches v_t^+ in H', then $v_t \in X^*$, and if s reaches v_t^- in H', then $v_t \notin X^*$.

Now, armed with the above claim, we can prove that in H', s does not reach both vertices of a forbidden pair $q \in P$, thus concluding this direction of the proof.

($\Leftarrow$) Suppose that there is a set $F \subseteq D$ with at most k' arcs such that s does not reach a forbidden pair in $H - F$. Denote $H' = H - F$. We construct X^* from F, which will also show that it can be reconstructed from F in polynomial time. Define $X^* \subseteq V(G)$ as follows:

- for each $v \in M_S$, add every element of $X \cap \tau(M_S)$ to X^*;
- for each $v_t \in V(G) \setminus \tau(M_S)$, we add v_t to X^* if and only if one of the following holds: (1) $v_t^+ \in V(H)$ and s reaches v_t^+ in H'; or (2) $v_t^- \in V(H)$, and s does *not* reach v_t^- in H';
- for each $v_j, v_h \in X^*$ with $j < h$, add v_t to X^* for each $t \in [j+1, h-1]$.

Note that X^* agrees with X. Indeed, for $v \in M_S$, there is no gadget corresponding to v in the construction and thus we only add $X \cap \tau(v)$ to X^*. For $u \in N_S$, consider $u_t \in N''_S$ and a neighbor v_t of u_t in $\tau(Z_S)$. If $v_t \notin Z'_S$, Step 4 adds an undeletable arc from s to v_t^+, hence s reaches that vertex and we put v_t in X^*. If $v_t \in Z'_S$, Step 4 adds $\{s, v_t^-\}$ to P, and thus s does not reach v_t^- in H', and again we add v_t to X^*. Therefore, we add all the $\tau(Z_S)$ neighbors of u_t to X^*, and so it agrees with X. We can prove that X^* covers every temporal edge of G and that $sp(X^*) \leq k$. ◀

Wrapping up

Before concluding, we must show that we are able to use the results of [16] to get an FPT algorithm for Constrained Digraph Pair Cut, as we have presented it. As we mentioned, the FPT algorithm in [16] studied the vertex-deletion variant and does not consider undeletable elements, but this is mostly a technicality. Roughly speaking, in our variant, it suffices to replace each vertex with enough copies of the same vertex, and replace each deletable arc (u, v) with a new vertex, adding arcs from the u copies to that vertex, and arcs from that vertex to the v copies. Deleting (u, v) corresponds to deleting that new vertex. For undeletable arcs, we apply the same process but repeat it $k' + 1$ times.

▶ **Lemma 16.** *The* Constrained Digraph Pair Cut *problem can be solved in time* $O^*(2^k)$*, where* k *is the number of arcs to delete.*

We are able now to prove the main result of our contribution.

▶ **Theorem 17.** *MinTimelineCover on a temporal graph* $G = (V_B, E, \mathcal{T})$ *can be solved in time* $O^*(2^{5k \log k})$.

Proof. First, we discuss the correctness of the algorithm we presented. Assume that we have an ordering on the base vertices of G and that v is the first vertex of this ordering. A solution S of MinTimelineCover on $G[\{v\}]$ is equal to $S = \emptyset$.

Then for i, with $i \in [2, |V_B|]$, let G_i be the temporal graph induced by the first i vertices and let w be the $i+1$-th vertex. Given a solution S of MinTimelineCover on instance G_i of span at most k, we can decide whether there exists a solution of MinTimelineCover on instance G_{i+1} by computing whether there exists a solution X^* of the Restricted Timeline Cover problem on instance G_i, w, S. By Lemma 10 and by Theorem 11 if there exists such an X^*, then there exists a feasible assignment X such that X^* agrees with X. By Lemma 14 we can compute, via the reduction to Constrained Digraph Pair Cut, whether there exists a solution of Restricted Timeline Cover on instance on instance G_i, w, S, and if so obtain such a solution (if no such solution X^* exists, then Lemma 14 also says that we will never return a solution, since every feasible assignment X that we enumerate will lead to a negative instance of Constrained Digraph Pair Cut). Thus the Restricted Timeline Cover subproblem is solved correctly, and once it is solved on $G_{|V_B|}$, we have a solution to MinTimelineCover.

Now, we discuss the complexity of the algorithm. We must solve Restricted Timeline Cover $|V_B|$ times. For each iteration, by Theorem 11 we can enumerate the feasible assignments in $O(2^{4k \log k} T^3 n)$ time. For each such assignment, the reduction from Restricted Timeline Cover to Constrained Digraph Pair Cut requires polynomial time, and each generated instance can be solved in time $O^*(2^k)$. The time dependency on k is thus $O^*(2^{4k \log k} \cdot 2^k)$, which we simplify to $O^*(2^{5k \log k})$. ◀

4 Conclusion

We have presented an FPT algorithm for the MinTimelineCover problem, a variant of Vertex Cover on temporal graphs recently considered for timeline activities summarizations. We point out some relevant future directions on this topic: (1) to improve, if possible, the time complexity of MinTimelineCover by obtaining a single exponential time algorithm (of the form $O^*(c^k)$); (2) to establish whether MinTimelineCover admits a polynomial kernel, possibly randomized (which it might, since Constrained Digraph Pair Cut famously admits a randomized polynomial kernel).

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