# Online Chromatic Number is PSPACE-Complete\*

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#### Abstract

In the online graph coloring problem, vertices from a graph G, known in advance, arrive in an online fashion and an algorithm must immediately assign a color to each incoming vertex v so that the revealed graph is properly colored. The exact location of v in the graph G is not known to the algorithm, since it sees only previously colored neighbors of v. The *online chromatic number* of G is the smallest number of colors such that some online algorithm is able to properly color G for any incoming order. We prove that computing the online chromatic number of a graph is PSPACE-complete.

## 1 Introduction

In the classical graph coloring problem we assign a color to each vertex of a given graph such that the graph is properly colored, i.e., no two adjacent vertices have the same color. The chromatic number  $\chi$  of a graph G is the smallest k such that G can be colored with k distinct colors. Deciding whether the chromatic number of a graph is at most k is well known to be NP-complete, even in the case with three colors.

The online variant of graph coloring can be defined as follows: The vertices of G arrive one by one, and an online algorithm must color vertices as they arrive so that the revealed graph is properly colored at all times. When a vertex arrives, the algorithm sees edges to previously colored vertices. The online algorithm may use additional knowledge of the whole graph G; more precisely, a copy of G is sent to the algorithm at the start of the input. However, the exact correspondence between the incoming vertices and the vertices of the copy of G is not known to the algorithm. This problem is called ONLINE GRAPH COLORING.

In this paper we focus on a graph parameter called *online chromatic number* which is analogous to the standard chromatic number of a graph.

**Definition 1.** The online chromatic number  $\chi^O(G)$  of a graph G is the smallest number k such that there exists a deterministic online algorithm which is able to color the specified graph G using k colors for any incoming order of vertices.

The online chromatic number has been studied since 1990 [6]. One of the main open problems in the area is the computational complexity of deciding whether  $\chi^O(G) \leq k$  for a specified simple graph G, given G and k on input; see e.g. Kudahl [13].

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**Definition 2.** The ONLINE CHROMATIC NUMBER problem is as follows: **Input:** An undirected simple graph G and an integer k. **Goal:** Decide whether  $\chi^O(G) \leq k$ .

In this paper, we fully resolve the computational complexity of this problem:

Theorem 1.1. The decision problem ONLINE CHROMATIC NUMBER is PSPACE-complete.

As is usual in the online computation model, we can view ONLINE GRAPH COLORING as a game between two players, which we call PAINTER (representing the online algorithm) and DRAWER (often called ADVERSARY in the online algorithm literature). In each round DRAWER chooses an uncolored vertex v from G and sends it to PAINTER without without any information to which vertex of G it corresponds, only revealing the edges to the previously sent vertices. Then PAINTER must properly color ("paint") v, i.e., PAINTER cannot use a color of a neighbor of v. We stress that in this paper PAINTER is restricted to be deterministic. The game continues with the next round until all vertices of G are colored.

**Examples.** Consider a path  $P_4$  on four vertices. Initially, DRAWER sends two nonadjacent vertices. If PAINTER assigns different colors to them, then these are the first and the third vertex of  $P_4$ , thus the second vertex must get a third color; otherwise they obtained the same color a and they are the endpoints of  $P_4$ , therefore the second and the third vertex get different colors which are not equal to a. In both cases, there are three colors on  $P_4$  and thus  $\chi^O(P_4) = 3$ , while  $\chi(P_4) = 2$ .

Note also that we may think of DRAWER deciding where an incoming vertex belongs at some time *after* it is colored provided that DRAWER's choice still allows for at least one isomorphism to the original G. This is possible only for a deterministic PAINTER.

A particularly interesting class of graphs in terms of  $\chi^O$  is the class of binomial trees. A binomial tree of order k, denoted  $B_k$ , is defined inductively:  $B_0$  is a single vertex (the root) and  $B_k$  is created by taking two disjoint copies of  $B_{k-1}$ , adding an edge between their roots and choosing one of their roots as the root for the resulting tree. Thus  $P_4$  with the root on the second vertex is  $B_2$ .

It is not hard to generalize the example of  $P_4$  and show  $\chi^O(B_k) = k + 1$  [6]. This shows that the ratio between  $\chi^O$  and  $\chi$  may be arbitrarily large even for the class of trees.

**History.** The online problem ONLINE GRAPH COLORING has been known since 1976 [1], originally studied in the variant where the algorithm has no extra information at the start of the input. Bean [1] showed that no online algorithm that is compared to an offline algorithm can perform well under this metric. The notion of online chromatic number was first defined in 1990 by [6].

For the online problem, Lovász, Saks and Trotter [14] show an algorithm with a *competi*tive ratio  $O(n/\log^* n)$ , where the competitive ratio is the ratio of the number of colors used by the online algorithm to the (standard) chromatic number. This was later improved to  $O(n \log \log \log \log n / \log \log n)$  by Kierstad [11] using a deterministic algorithm. There is a better  $O(n/\log n)$ -competitive randomized algorithm against an oblivious adversary by Halldórsson [8]. A lower bound on the competitive ratio of  $\Omega(n/\log^2 n)$  even for randomized algorithms against an oblivious adversary was shown by Halldórsson and Szegedy [10].

Our variant of ONLINE GRAPH COLORING, where the algorithm receives a copy of the graph at the start, was suggested by Halldórsson [9], where it is shown that the lower bound

 $\Omega(n/\log^2 n)$  also holds in this model. (Note that the previously mentioned algorithmic results are valid for this model also.)

Kudahl [12] recently studied ONLINE CHROMATIC NUMBER as a complexity problem. The paper shows that the problem is coNP-hard and lies in PSPACE. Later [13] he proved that if some part of the graph is precolored, i.e., some vertices are assigned some colors prior to the coloring game between DRAWER and PAINTER and DRAWER also reveals edges to the precolored vertices for each incoming vertex, then deciding whether  $\chi^O(G) \leq k$  is PSPACE-complete. We call this decision problem ONLINE CHROMATIC NUMBER WITH PRECOLORING. The paper [13] conjectures that ONLINE CHROMATIC NUMBER (with no precolored part) is PSPACE-complete too. Interestingly, it is possible to decide  $\chi^O(G) \leq 3$  in polynomial time [7].

**Related work.** Deciding the outcome of many two-player games is PSPACE-complete; among those are (generalizations of) Amazons, Checkers and Hex, to name a few.

The closest PSPACE-complete two-player game to our model is arguably SEQUENTIAL COL-ORING GAME, where two players color vertices in a fixed order and the first player to use more than k colors loses the game. This game was defined and analyzed by Bodlaender [2].

However, in all of the games mentioned above, both players have roughly the same power. This does not hold for ONLINE GRAPH COLORING which is highly asymmetric, since DRAWER has perfect information (knows which vertices are sent and how they are colored), but PAINTER does not. PAINTER may only guess to which part of the graph does the colored subgraph really belong. This is the main difficulty in proving PSPACE-hardness.

An example of an asymmetric two-player game somewhat related to ONLINE GRAPH COL-ORING is the ONLINE RAMSEY GAME in which Builder draws edges and Painter colors each edge either red, or blue. Builder wins if it forces a monochromatic copy of a graph H, otherwise Painter wins. The condition for Builder is that at the end the revealed graph must belong to a certain class of graphs. Deciding whether Builder wins was recently shown to be PSPACE-complete [5], however, the proof assumes that some of the edges may be precolored.

Another recently studied asymmetric model is the CHOOSER-PICKER POSITIONAL GAME. In it, the player Chooser selects a pair of objects, and the player Picker selects one of them for itself, leaving the other object for the player Chooser. The winning condition is then similar to Maker-Breaker games, such as ONLINE RAMSEY GAME described above. A recent paper [4] proves NP-hardness for this problem, but PSPACE-hardness remains open.

**Proof outline.** The fact that ONLINE CHROMATIC NUMBER belongs to PSPACE is not hard to see: The online coloring is represented by a game tree which is evaluated using the Minimax algorithm. This can be done in polynomial space, since the number of rounds in the game is bounded by n, i.e., the number of vertices, and possible moves of each player can be enumerated in polynomial space: PAINTER has at most n possible moves, because it either uses a color already used for a vertex, or it chooses a new color, and DRAWER has at most  $2^s$  moves where s is the number of colored vertices, since it chooses which colored vertices shall be adjacent to the incoming vertex. DRAWER must ensure that sent vertices form an induced subgraph of G, but this can be checked in polynomial space.

Inspired by [13], we prove the PSPACE-hardness of ONLINE CHROMATIC NUMBER by a reduction from Q3DNF-SAT, i.e., the satisfiability of a fully quantified formula in the 3-disjunctive normal form (3-DNF). An example of such a formula is

$$\forall x_1 \exists x_2 \forall x_3 \exists x_4 \dots : (x_1 \land x_2 \land \neg x_3) \lor (\neg x_1 \land x_2 \land \neg x_4) \lor \dots$$

The similar problem of satisfiability of a fully quantified formula in the 3-conjunctive normal form is well known to be PSPACE-complete. Since PSPACE is closed under complement, Q3DNF-SAT is PSPACE-complete as well. Note that by an easy polynomial reduction, we can assume that each 3-DNF clause contains exactly three literals.

We show the hardness in several iterative steps. First, in Section 2, we present a new, simplified proof of the PSPACE-hardness of ONLINE CHROMATIC NUMBER WITH PRECOLORING in which the sizes of both precolored and non-precolored parts of our construction are linear in the size of the formula.

Then, in Section 3, we strengthen the result by reducing the size of the precolored part to be logarithmic in the size of the formula. This is achieved by adding linearly many vertices to our construction.

Finally, in Section 4, we show how to remove one precolored vertex and replace it by a non-precolored part, while keeping the PSPACE-hardness proof valid. The cost for removing one vertex is that the size of the graph is multiplied by a constant, but since we apply it only logarithmically many times, we obtain a graph of polynomial size and with no precolored vertex. This will complete the proof of Theorem 1.1.

In our analysis, PAINTER often uses the natural greedy algorithm FIRSTFIT, which is ubiquitous in the literature (see [14], [9]):

**Definition 3.** The online algorithm FIRSTFIT colors an incoming vertex u using the smallest color not present among colored vertices adjacent to u.

We remark that removing the last precolored vertex is the most difficult part of proving PSPACE-hardness of ONLINE CHROMATIC NUMBER. While there might be an easier way how to remove the penultimate precolored vertex (using the last precolored vertex) and similarly for previous precolored vertices, for simplicity we use the same technique for removing all precolored vertices as for removing the last precolored vertex. Also, our technique can be used for any graph satisfying an assumption.

We note that if we would give PAINTER some advantage like parallel edges, precolored vertices (as in [13]) or something that helps PAINTER distinguish different parts of the graph, the proof of PSPACE-hardness would be much simpler. However, our theorem holds for simple graphs without any such help.

# 2 Construction with a large precolored part

Our first construction will reduce the PSPACE-complete problem Q3DNF-SAT to ONLINE COLORING WITH PRECOLORING with a large precolored part. Given a fully quantified formula Q in the 3-disjunctive normal form, we will create a graph  $G_1$  that will simulate this formula. We assume that the formula contains n variables  $x_i$ ,  $(1 \le i \le n)$  and m clauses  $C_a$ ,  $(1 \le a \le m)$ , and that variables are indexed in the same order as they are quantified.

Our main resource will be a large precolored clique  $K_{col}$  on k vertices and naturally using k colors; the number k will be specified later. Using such a precolored clique, we can restrict the allowed colors on a given uncolored vertex v by connecting it with the appropriate vertices in  $K_{col}$ , i.e., we connect v to all vertices in  $K_{col}$  which do not have a color allowed for v.

For simplicity we use the precoloring in the strong sense, i.e., PAINTER is able to recognize which vertex in  $K_{col}$  is which. We use this to easily recognize colors. However, it is straightforward to avoid the strong precoloring by modifying the precolored part; for example by creating *i* independent and identical copies of the *i*-th vertex in  $K_{col}$ , each having the same color and the same edges to other vertices in  $K_{col}$  and the rest of the graph. With such a modification, PAINTER would be able to recognize each color by the number of its vertices in  $K_{col}$ . We also remark that working with the strong precoloring is easier in the reduction, and since we eventually obtain a graph without a precolored vertex, it does not matter which precoloring we use.

Each vertex in  $K_{col}$  thus corresponds to a color. Colors used by PAINTER are naturally denoted by numbers 1, 2, 3, ... k, but we shall also assign meaningful names to them.

We now construct a graph  $G_1$  that has the online chromatic number k if and only if the quantified 3-DNF formula can be satisfied. See Figure 1 for an example of  $G_1$  and an overview of our construction. We use the following gadgets for variables and clauses:

1. For a variable  $x_i$  which is quantified universally, we will create a gadget consisting of  $\forall$ vertices  $x_{i,t}$  and  $x_{i,f}$ , connected by an edge. The vertex  $x_{i,t}$  represents the positive literal  $x_i$ , while  $x_{i,f}$  represents the negative literal  $\neg x_i$ . Both vertices have exactly two allowed colors: set<sub>i</sub> and unset<sub>i</sub>. If  $x_{i,t}$  is assigned the color set<sub>i</sub>, it corresponds to setting the variable  $x_i$  to 1, and vice versa.

Note that if DRAWER presents a vertex  $x_{i,t}$  to PAINTER, PAINTER is able to recognize that it is a vertex corresponding to the variable  $x_i$ , but it is not able to recognize whether it is the vertex  $x_{i,t}$  or  $x_{i,f}$ .

2. For a variable  $x_j$  which is quantified existentially, we will create a gadget consisting of three  $\exists$ -vertices  $x_{j,t}$  (for the positive literal  $x_j$ ),  $x_{j,f}$  (for the literal  $\neg x_j$ ) and  $x_{j,h}$  (the helper vertex), connected as a triangle.

Coloring of the first two variables also corresponds to setting the variable  $x_j$  to true or false, but in a different way:  $x_{j,t}$  has allowed colors set<sub>j,t</sub> and unset<sub>j</sub>, while  $x_{j,f}$  has allowed colors set<sub>j,f</sub> and unset<sub>j</sub>. We want to avoid both  $x_{j,t}$  and  $x_{j,f}$  to have the color of type set, and so the "helper" vertex  $x_{j,h}$  can be colored only by set<sub>j,t</sub> or set<sub>j,f</sub>.

Note that the color choice for the vertices of  $x_j$  means that if PAINTER is presented any vertex of this variable, PAINTER can recognize it and decide whether to set  $x_j$  to 1 (and color accordingly) or to 0.

We call  $\exists$ -vertices and  $\forall$ -vertices together variable vertices.

- 3. For each clause  $C_a$ , we will add four new vertices.
  - (a) First, we create a vertex  $l_{a,i}$  for each literal in the clause, which is connected to one of the vertices  $x_{i,t}$  and  $x_{i,f}$  corresponding to the sign of the literal. For example if  $C_a = (x_i \wedge \neg x_j \wedge x_k)$ , then  $l_{a,i}$  is connected to  $x_{i,t}$ ,  $l_{a,j}$  is connected to  $x_{j,f}$  and  $l_{a,k}$ to  $x_{k,t}$ . The allowed colors on a vertex  $l_{a,i}$  are  $\{f_a, \text{unset}_i\}$ .
  - (b) Finally, we add a fourth vertex  $d_a$  connected to the three vertices  $l_{a,i}, l_{a,j}, l_{a,k}$ . This vertex can be colored only using the color  $f_a$  or the color false<sub>a</sub>. The color false<sub>a</sub> is used to signal that this particular clause is evaluated to 0. If the color  $f_a$  is used for the vertex  $d_a$ , this means that the clause is evaluated to 1, because  $f_a$  is not present on any of  $l_{a,i}, l_{a,j}, l_{a,k}$ , thus they have colors of type unset<sub>i</sub> and their neighbors corresponding to literals have colors of type set.
- 4. The last vertex we add to the construction will be F, a final vertex. The vertex F is connected to all the vertices  $d_a$  corresponding to the clauses. The allowed colors of the vertex F are false<sub>1</sub>, false<sub>2</sub>, false<sub>3</sub>, ..., false<sub>m</sub>. This final vertex corresponds to the final evaluation of the formula. If all clauses are evaluated to 0, the vertex F has no available color left and must use a new color.

We have listed all the vertices and colors in our graph  $G_1$  and the functioning of our gadgets,

but we will need slightly more edges. The reasoning for the edges is as follows: If DRAWER presents any vertex of the type  $l_{a,i}, d_a$  or F before presenting the variable vertices, or in the case when the variable vertices are presented out of the quantifier order, we want to give an advantage to PAINTER so it can finalize the coloring.

This will be achieved by allowing PAINTER to treat all remaining  $\forall$ -vertices as  $\exists$ -vertices, i.e., PAINTER can recognize which of the two  $\forall$ -vertices  $x_{j,t}, x_{j,f}$  corresponds to setting  $x_j$  to 1. To be precise, we add the following edges to  $G_1$ :

- Every  $\exists$ -vertex  $x_{j,t}, x_{j,f}, x_{j,h}$  is connected to all previous  $\forall$ -vertices  $x_{i,t}$ , that is to all such  $x_{i,t}$  for which i < j.
- Every  $\forall$ -vertex  $x_{j,t}, x_{j,f}$  is connected to all previous  $\forall$ -vertices  $x_{i,t}$  such that i < j. (We remark that these edges are not necessary, but make the following analysis simpler.)
- Every vertex of type  $l_{a,i}$  is connected to all the  $\forall$ -vertices  $x_{i't}$  for  $i' \neq i$ . Note that  $l_{a,i}$  is connected either to  $x_{i,t}$ , or to  $x_{i,f}$ ; we do not add a new edge to such vertices.
- Every vertex of type  $d_a$  is connected to all the  $\forall$ -vertices  $x_{i,t}$  for all i.
- The vertex F is connected to all the  $\forall$ -vertices  $x_{i,t}$  for all i.

See Figure 1 for an example of our graph  $G_1$ . We call all non-precolored vertices the *gadgets* for variables and clauses.



Figure 1: The construction for a sample formula. The thick black edges are the normal edges of the construction, and the dashed orange edges are the additional edges that guarantee precedence of vertices. The lists of allowed colors of each vertex are not listed in the figure.

It is easy to see that any two vertices outside  $K_{col}$  have different sets of allowed colors except  $\forall$ -vertices  $x_{i,t}$  and  $x_{i,f}$ .

The number of colors allowed for PAINTER (the same as the size of  $K_{col}$ ) is  $k = 2m + 2n_{\forall} + 3n_{\exists}$ where m is the number of clauses,  $n_{\forall}$  the number of universally quantified variables and  $n_{\exists}$  the number of existentially quantified variables.

The next two lemmas contain the analysis of our construction.

**Lemma 2.1.** For a given fully quantified formula in the 3-DNF form that is not satisfiable, DRAWER can force PAINTER to use k + 1 colors.

*Proof.* If anytime during the game PAINTER uses a color not present in the color clique  $K_{col}$ , the lemma is proven. We therefore assume this does not happen and show that the vertex F cannot be colored with any color present in the precolored clique  $K_{col}$ .

DRAWER's strategy is to first present the vertices  $x_*$  in the the order in which the variables are quantified in the formula. Whenever DRAWER sends a  $\forall$ -vertex  $x_{i,t}$  or  $x_{i,f}$ , PAINTER is not able to detect whether it is setting the value of  $x_i$  to 1 or 0. As the formula is not satisfiable, DRAWER can therefore present these vertices in a sequence such that PAINTER chooses the value of  $x_i$  so that the final evaluation is false.

After the vertices of the variables, DRAWER will present the vertices  $l_{a,i}$  for each clause, then the vertex  $d_a$  for each clause, and finally the vertex F.

We now know that all clauses are evaluated to 0. This means that at least one of the vertices  $l_{a,i}, l_{a,j}, l_{a,k}$  of each clause a is assigned the color  $f_a$ . It follows that the vertex  $d_a$  of this clause must be assigned the color false<sub>a</sub>. This holds for all clauses, thus the vertex F has a neighbor of the color false<sub>a</sub> for each clause a. Hence, F cannot get any of the k colors allowed and needs to be assigned a new color, which completes the proof.

**Lemma 2.2.** For a given fully quantified formula in the 3-DNF form that is satisfiable, and for any order of sending vertices by DRAWER, PAINTER has a strategy that uses k colors.

*Proof.* PAINTER's goal is to use the knowledge of a satisfiable evaluation to paint the vertices with few colors. We note the following two observations. The first follows easily from the sets of allowed colors.

**Observation 2.3.** If DRAWER presents a vertex, PAINTER is able to recognize it by the set of edges to the clique  $K_{col}$ , i.e., by the set of allowed colors, with the exception of  $\forall$ -vertices  $x_{i,t}, x_{i,f}$  for a universally quantified variable  $x_i$ .

**Observation 2.4.** If DRAWER presents a vertex of type  $l_{a,i}$ ,  $d_a$  or F before any of the  $\forall$ -vertices  $x_{i,t}, x_{i,f}$  is presented for a universally quantified variable  $x_i$ , PAINTER will be able to distinguish the vertex  $x_{i,t}$  from the vertex  $x_{i,f}$  and therefore choose the assignment of  $x_i$ .

Furthermore, for  $\forall$ -vertices  $x_{i,t}, x_{i,f}$  and for a vertex v of a variable  $x_j$  with i < j, if DRAWER presents v before any of these  $\forall$ -vertices is sent, PAINTER is then able to distinguish the  $\forall$ -vertices  $x_{i,t}$  and  $x_{i,f}$ .

The second observation is easy to see by noting that presenting  $v, l_{a,i}, d_a$  or F means that it has an edge with  $x_{i,t}$ , but not with  $x_{i,f}$  (or, in the case of  $l_{a,i}$ , it may have an edge with  $x_{i,f}$ , but not with  $x_{i,t}$ , but this is symmetric). This means that we can distinguish  $x_{i,t}$  from  $x_{i,f}$  by the presence or absence of an edge.

We continue with the proof of the lemma. We say that a variable  $x_i$  is *set*, if at least one of its vertices was colored or if PAINTER has assigned a value to it (e.g., if a vertex of a variable  $x_j$  was sent before a vertex of  $x_i$  for j > i); otherwise  $x_i$  is *unset*. Until DRAWER presents a vertex of type  $l_{a,i}, d_a$ , or F, PAINTER colors an incoming vertex v that corresponds to a variable  $x_i$  using the following strategy:

- Let U be the set of all unset variables  $x_j$  with j < i, i.e., all previous unset variables. PAINTER chooses an assignment for all variables in U according to satisfiability of the formula. Then PAINTER can color vertices for variables in U according to this assignment, since it is now able to distinguish  $\forall$ -vertices of each universally quantified variable in U. Therefore every variable in U becomes set.
- If the variable  $x_i$  is not set and it is quantified universally, PAINTER chooses an arbitrary allowed color for v (set<sub>i</sub> or unset<sub>i</sub>), thus  $x_i$  becomes set.
- If  $x_i$  is not set and it is quantified existentially, PAINTER knows how to set this variable to satisfy the formula, thus PAINTER colors v according to the value of  $x_i$ , since v can be recognized.
- If  $x_i$  is set and PAINTER can recognize which vertex is v, it colors v according to the setting of  $x_i$ .
- If  $x_i$  is set and PAINTER cannot recognize v, then  $x_i$  must be quantified universally and the other vertex for  $x_i$  is colored, therefore there is a single color left for v. (Note that in this case no vertex for a variable  $x_j$  with j > i arrived.)

When the vertex u of type  $l_{a,i}, d_a$ , or F is sent, let U be the set of all unset variables. PAINTER chooses an assignment for all variables in U according to satisfiability of the formula. Then PAINTER can color vertices for variables in U according to this assignment, since it is now able to distinguish vertices of each universally quantified variable in U. Then all variables are set and PAINTER decides how to color all remaining vertices in the graph using the following rules:

- A variable vertex obtains color according to the setting of the corresponding variable.
- A vertex of type  $l_{a,i}$  gets unset<sub>i</sub> if its adjacent variable vertex  $x_{i,t}$  or  $x_{i,f}$  has a color of type set; otherwise it gets  $f_a$
- A vertex of type  $d_a$  obtains color  $f_a$  if all of its adjacent vertices of type  $l_{a,i}$  have colors of type unset, i.e., the clause *a* evaluates to 1; otherwise it obtains color false<sub>*a*</sub>.
- The final vertex F obtains a color false<sub>a</sub> for a clause a that evaluates to 1. Since PAINTER set variables such that the formula is satisfied, there must be such clause.

Now, PAINTER colors an incoming vertex v with the color assigned to it using these rules. Hence, no matter in which order DRAWER sends the vertices, the graph is colored using k colors as desired.

# 3 Construction with a precolored part of logarithmic size

We now make a step to the general case without precoloring by reducing the size of the precolored part so that it has only logarithmic size. Our construction is based on the one with a large precolored part; namely, all the vertices  $x_{i,t}, x_{i,f}, x_{j,t}, x_{j,f}, x_{j,h}, l_{a,i}, d_a, F$  (the gadgets for variables and clauses) and the whole color clique  $K_{col}$  will be connected the same way. Let  $G_1$ denote the gadgets for variables and clauses and  $K_{col}$ .

Since  $K_{col}$  now starts uncolored and DRAWER may send it after the gadgets, we help PAINTER by a structure for recognizing vertices in  $G_1$  or for saving colors.

We remark that there is also a simpler construction with a logarithmic number of precolored vertices. If we just add a clique of logarithmically many precolored vertices to recognize vertices in  $G_1$ , the following proof would work and be easier. However, when we replace a precolored vertex v by some non-precolored graph in Section 4, we will use some conditions that this simple construction would not satisfy. Namely, we shall need that precolored vertices are not adjacent

to  $G_1$ .

### 3.1 Nodes

Our structure will consist of many small *nodes*, all of them have the same internal structure, only their adjacencies with other vertices vary.

Each node consists of three vertices and a single edge; vertices are denoted by  $p_1, p_2, p_3$ and the edge leads between  $p_2$  and  $p_3$ . We call the vertices  $p_1$  and  $p_2$  the *lower partite* set of the node,  $p_3$  form the *upper partite set*. See Figure 2 for an illustration of a node. Clearly, the online chromatic number of a node is two.

The intuition behind the nodes is as follows:

- If DRAWER presents vertices of a node in the correct way, PAINTER needs to use two colors in the lower partite set of the node.
- No color can be used in two different nodes.
- Each vertex  $v \in G_1$  (in the gadgets and in  $K_{col}$ ) has its own associated node A. If the vertex  $p_3$  from A does not arrive before v is sent, PAINTER Figure 2: Node can color  $p_3$  and v with the same color, thus saving a color. Otherwise, PAINTER can use the node to recognize v.
- $\forall$ -vertices  $x_{i,t}, x_{i,f}$  for each universally quantified variable  $x_i$  should be distinguishable only by the same vertices as in the previous section. Therefore they are both associated with the same two nodes.

Let N be the number of vertices in  $G_1$ . We create N nodes, denoted by  $A_1, \ldots, A_N$ , one for each vertex in  $G_1$ . For any two distinct nodes  $A_i$  and  $A_j$   $(i \neq j)$ , there is an edge between each vertex in  $A_i$  and each vertex in  $A_j$ . Therefore, no color can be used in two nodes.

We have noted above that each node is associated with a vertex; we now make the connection precise. Let  $v_1, \ldots, v_N$  be the vertices in  $G_1$  (in an arbitrary order). Then we say that  $A_i$ *identifies* the vertex  $v_i$ . Moreover, if  $v_i$  is a vertex  $x_{\ell,t}$  or  $x_{\ell,f}$  for a universally quantified variable  $x_{\ell}$  and  $v_j$  is the other vertex, then  $A_j$  also identifies  $v_i$  and  $A_i$  also identifies  $v_j$ . Thus each node identifies one or two vertices and each vertex is identified by one or two nodes.

Edges between a vertex v in the original construction  $G_1$  and a node depend on whether the node identifies v, or not. For a vertex  $v \in G_1$  and for a node A, if A identifies v, we connect only the whole lower partite set of A to v, i.e., we add two edges from v to both  $p_1$  and  $p_2$  of A. Otherwise, we add three edges – one between v and every vertex in A.

#### 3.2 Precolored vertices

The only precolored part P of the graph is intended for distinguishing nodes. Since there are N nodes in total, we have  $p = \lceil \log_2 N \rceil$  precolored vertices  $z_1, z_2, \ldots z_p$  with no edges among them. Precolored vertices have the same color that may be used later for coloring  $G_1$  (the gadgets and  $K_{col}$ ). For simplicity, we again use the precoloring in the strong sense, i.e., PAINTER is able to recognize which precolored vertex is which.

We connect all vertices in the node  $A_i$  to  $z_j$  if the *j*-th bit in the binary notation of *i* is 1; otherwise  $z_j$  is not adjacent to any vertex in  $A_i$ .

Clearly, the node to which an incoming vertex belongs can be recognized by its adjacency to the precolored vertices. Note that a vertex from nodes is connected to at least one precolored vertex and there is no edge between  $G_1$  and precolored vertices.



So far, we have introduced all vertices and edges in our construction of the graph  $G_2$ . To summarize, our graph  $G_2$  consists of three *parts*:

- 1. The graph  $G_1$  from the previous section consisting of the color clique  $K_{col}$  and of the gadgets for variables and clauses, i.e., vertices  $x_{i,t}, x_{i,t}, x_{j,t}, x_{j,t}, x_{j,h}, l_{a,i}, d_a, F$ ;
- 2. the nodes for recognizing vertices in  $G_1$ ;
- 3. the precolored vertices P for recognizing the nodes.

See Figure 3 for a simplified example of the graph  $G_2$ .



Figure 3: A visualisation of the construction with logarithmically many precolored vertices. Not all edges of the construction are present, e.g., dashed edges from Figure 1, most edges between nodes and  $G_1$ , and precolored vertices are connected only to  $p_3$  of a displayed node, although they are connected either to all vertices in a node, or to none of them. The now uncolored clique  $K_{col}$  is connected the same way as it was in Section 2. Notice that  $x_{1,t}$  and  $x_{1,f}$  are identified by the first node (as they are connected only to  $p_1$  and  $p_2$  of the first node), but  $x_{1,t}$  is not identified by the third node (as it is connected to all vertices of the third node).

We start with an observation about nodes.

**Observation 3.1.** If DRAWER reveals all the nodes  $A_i$  before it sends any vertex from  $G_1$  (the gadgets and  $K_{col}$ ), DRAWER can force PAINTER to use two colors in the lower partite set of each node and these colors are different for each node.

*Proof.* First we see that PAINTER is not able to distinguish incoming vertices from a node A by their edges to vertices in other nodes, since there is a complete bipartite graph between any two nodes.

Thus DRAWER uses the following strategy for each node A independently: DRAWER first presents the vertex  $p_1$  from A; let c be its color. Then DRAWER sends a vertex q that is one of vertices  $p_2$  and  $p_3$ . PAINTER cannot deduce which of them is q, because both are not connected to  $p_1$  (and both are connected to all vertices in other nodes). If PAINTER assigns the color cto q, then  $q = p_3$  and DRAWER sends  $p_2$  which must get another color than c. Otherwise if qobtains another color than c, then  $q = p_2$ .

PAINTER has 2N colors for the N nodes and k colors for  $G_1$  (with the same names as in the previous section), thus overall PAINTER is allowed to use  $k' = 2N + k = 2N + 2m + 2n_{\forall} + 3n_{\exists}$  colors where m is the number of clauses,  $n_{\forall}$  the number of universally quantified variables and  $n_{\exists}$  the number of existentially quantified variables. The precolored vertices have a color that may be used later in  $G_1$ .

### **Lemma 3.2.** For a given fully quantified formula Q in the 3-DNF form that is not satisfiable, DRAWER can force PAINTER to use k' + 1 colors.

*Proof.* If at any point of the game there are k' + 1 colors in the graph, the lemma is proven. DRAWER's strategy is to first present all nodes (in any order) and force to use two colors in the lower partite set of each node. Moreover, PAINTER has to use different colors in distinct nodes. Forcing such a coloring is possible by Observation 3.1.

Then DRAWER sends  $K_{col}$  and the situation is similar to the one with the precolored  $K_{col}$ , since none of two colors used in the lower partite set of a node is allowed for a vertex in  $G_1$ , thus PAINTER must use the k colors in  $K_{col}$  for coloring the gadgets. PAINTER is able to recognize vertices in  $K_{col}$  by nodes, but nodes do not give PAINTER additional knowledge compared to  $K_{col}$ . In particular, PAINTER is not able to distinguish  $\forall$ -vertices  $x_{i,t}, x_{i,f}$  for a universally quantified variable  $x_i$  when one of them arrives. We conclude the proof by applying Lemma 2.1.

For a satisfiable formula nodes and precolored vertices become important. We give another useful observation about nodes.

**Observation 3.3.** Suppose that PAINTER is using FIRSTFIT, i.e., PAINTER always assigns the smallest color not present among colored vertices adjacent to the incoming vertex. Then there are at most two colors used on each node.

Moreover, if vertices  $p_1$  and  $p_2$  from a node A arrive before  $p_3$  from A, then  $p_1$  and  $p_2$  have the same color.

*Proof.* Consider the last vertex q from a node A that is sent from A. We distinguish three cases:

- $q = p_1$ : Let the color of  $p_2$  be c and the color of  $p_3$  be d (clearly  $c \neq d$ ). Since the edges from  $p_1$  and  $p_2$  to other vertices in the construction except  $p_3$  are exactly the same, PAINTER can use c for  $p_1$ , but it cannot use any color forbidden for  $p_2$  when  $p_2$  was colored with the possible exception of d. Hence  $p_1$  obtains c or d, but in both cases the node A has two colors.
- $q = p_2$ : Let the color of  $p_1$  be c and the color of  $p_3$  be d. If  $c \neq d$ , PAINTER uses c for  $p_2$  for the same reason as in the previous case. Otherwise c = d and PAINTER must color  $p_2$  with another color, but there are two colors on A.
- $q = p_3$ : We show that  $p_1$  and  $p_2$  have the same color. Without loss of generality,  $p_1$  arrives first and obtains a color c. When  $p_2$  arrives, it can be colored by c, but by no other color c' < c, since c' would be available for  $p_1$  also when  $p_1$  was colored, because the edges from  $p_1$  and  $p_2$  to other vertices except  $p_3$  are the same. Hence  $p_1$  and  $p_2$  have the same color and the lemma follows.

PAINTER's strategy to win is basically the following: Color vertices in nodes greedily until a vertex u from  $G_1$  arrives. At this time, some (but maybe not all) vertices in the gadgets can be recognized by their nodes. PAINTER uses the winning strategy from Lemma 2.2 on the gadgets for vertices that it can recognize, even if  $K_{col}$  has arrived only partially. For each vertex v that cannot be recognized, PAINTER is able to color (or already colored) the lower partite set of the v's node A with only one color, therefore it can use the same color for v and the vertex  $p_3 \in A$ , since they are not adjacent.

In the following proof, PAINTER waits for two nonadjacent vertices in  $G_1$ , even although one vertex from  $G_1$  suffices. The reason is the we shall need such a condition in Section 4 when we remove precolored vertices.

**Lemma 3.4.** For a given fully quantified formula Q in the 3-DNF form that is satisfiable, and for any order of sending vertices by DRAWER, PAINTER has a strategy that uses k' colors.

*Proof.* Let  $\mathcal{C}$  be the set of 2N colors for nodes and let  $\mathcal{D}$  be the set of k colors for  $G_1$  (the gadgets and  $K_{col}$ ) including the color used on precolored vertices; both  $\mathcal{C}$  and  $\mathcal{D}$  are ordered arbitrarily and  $\mathcal{C} \cap \mathcal{D} = \emptyset$ .

PAINTER utilizes the precolored part P to decide whether an incoming vertex belongs to  $G_1$  (recall that  $G_1$  is the part of  $G_2$  not adjacent to any precolored vertex), or to a node (and to which node). First, PAINTER uses the following algorithm:

**Algorithm** GREEDY: For an incoming vertex *u* sent by DRAWER:

- 1. If there are two nonadjacent vertices  $u_1$  and  $u_2$  in  $G_1$  that arrived, stop the algorithm.
- 2. If u is from nodes, assign u the smallest color from C not present among colored neighbors of u.
- 3. Otherwise, if u is from  $G_1$ , assign u the smallest color from  $\mathcal{D}$  not present among colored neighbors of u.

Note that the last u considered by GREEDY is not yet colored and u is from  $G_1$ . Observe that only a clique is colored in  $G_1$  and this clique has at most k vertices.

Let  $u_1$  and  $u_2$  be the two nonadjacent vertices from the stopping condition of GREEDY. Observe that the nodes identifying  $u_1$  and  $u_2$  are different, since these nodes can be the same only for both  $\forall$ -vertices of one variable, but these vertices are adjacent.

PAINTER continues by the following algorithm. We remark that by "PAINTER can recognize  $u \in G_1$ " we mean that PAINTER knows which vertex in  $G_1$  corresponds to u unless u is one of the two vertices for a universally quantified variable  $x_i$  – then PAINTER knows that one of  $u = x_{i,t}$  and  $u = x_{i,f}$  holds.

**Algorithm** WINNING: PAINTER creates a virtual graph  $G_{\text{virt}}$  with all colored vertices in  $G_1$ ; the colors of such vertices are inherited from the graph  $G_2$ .

PAINTER shall simulate its winning strategy on  $G_{\text{virt}}$  using colors from  $\mathcal{D}$ . Since only a clique is colored in  $G_{\text{virt}}$ , it renames colors so that the colored vertices have colors according to the winning strategy on  $G_{\text{virt}}$ . PAINTER remembers the colors of vertices in the virtual graph  $G_{\text{virt}}$ .

For an incoming vertex u sent by DRAWER:

- 1. If u is from  $G_1$ :
- 2. If there is a vertex v in nodes that is not adjacent to u, then v is from one of at most two nodes identifying u and PAINTER can recognize u. A virtual DRAWER sends u to  $G_{\text{virt}}$  and let  $c \in \mathcal{D}$  be the color that it obtains by the winning strategy of PAINTER on  $G_{\text{virt}}$  by Lemma 2.2. Color u in  $G_2$  using c and call u recognized.
- 3. Otherwise, assign u the smallest color from C not present among colored neighbors of u and not used in  $G_1$ .
- 4. If u is from a node A:
- 5. If a vertex v from  $G_1$  identified by A is colored by c, there is no edge between v and u,  $c \in C$  and c is not present among nodes, then color u using c.
- 6. Otherwise, assign u the smallest color from C not present among colored neighbors of u.

If u is from  $G_1$  and PAINTER can recognize it by a nonadjacent vertex v from nodes (line 2), then coloring it with the winning strategy is correct, since vertices that have a color from  $\mathcal{D}$  in  $G_2$  have the same color in  $G_{\text{virt}}$ .

Otherwise, if PAINTER cannot recognize u from  $G_1$  (line 3), the vertex  $p_3$  from each node A that serves for identifying u is not yet sent. It follows that there is at most one color used in the lower partite set of A by Observation 3.3. In this case, u gets some color c from C that is not used in  $G_1$ . We want to show that c will be used on the vertex  $p_3$  from a node that identifies u.

To see this, observe that when the vertex  $p_3$  from a node A that identifies u arrives, the condition on line 5 is satisfied and  $p_3$  obtains c unless the color c is already used in nodes. Thus if the unrecognized vertex u from  $G_1$  is not a  $\forall$ -vertex, it has the same color as the vertex  $p_3$  from the single node A identifying v, since c can be used in nodes only for  $p_3$  of the node A.

Otherwise, if u is an unrecognized  $\forall$ -vertex, then u is identified by two nodes A and A'. Both vertices  $p_3$  from A or A' arrive after u and one of them obtains c, since the algorithm prefers to use colors of v and possibly of the other  $\forall$ -vertex for the same variable (if its color is in C).

Recognized vertices from  $G_1$  are colored by the wining strategy on  $G_{\text{virt}}$  using k colors from  $\mathcal{D}$ . As we have shown above, each unrecognized vertex v has the same color as a vertex  $p_3$  in one of the nodes identifying v. There are at most 2N colors used in nodes by Observation 3.3 and all of them are from  $\mathcal{C}$ . Thus PAINTER uses at most k' = 2N + k colors.  $\Box$ 

# 4 Removing precoloring

In this section we show how to replace one precolored vertex by a large nonprecolored graph whose size is a constant factor of the size of the original graph, while keeping PAINTER's winning strategy in the case of a satisfiable formula. DRAWER's winning strategy in the other case is of course preserved as well and easier to see. We prove the following lemma which holds for all graphs with precolored vertices satisfying an assumption.

**Lemma 4.1.** Let G be a graph with precolored subgraph  $G_p$  and let  $v_p \in G_p$  be a precolored vertex of G.

Let D be the induced subgraph with all nonprecolored vertices that are not connected to  $v_p$ and let E be the induced subgraph with all nonprecolored vertices that are connected to  $v_p$ . Let k be an integer such that if  $\chi^O(G) \leq k$ , then there exists a winning strategy of PAINTER where PAINTER colors E using FIRSTFIT before two nonadjacent vertices from D arrive. Moreover, in this case if FIRSTFIT assigns the same color to a vertex in D and to a vertex in E before two nonadjacent vertices from D arrive, PAINTER can still color G using k colors.

Then there exists an integer k' and a graph G' with the following properties:

- G' has only  $|V(G_p)| 1$  precolored vertices, and  $|V(G')| \le 25|V(G)|$ ,
- G' can be constructed from G in polynomial time with respect to the size of G,
- it holds that  $\chi^O(G') \leq k'$  if and only if  $\chi^O(G) \leq k$ .

Note that we do not assume anything about D or E except that E may be colored by PAINTER using FIRSTFIT before two nonadjacent vertices from D arrive. We give a proof of Theorem 1.1 using Lemma 4.1 in Section 4.1.

**Construction of** G'. Let N be the total number of vertices in D and E and let S = 8N. Our graph G' consists of precolored part  $G'_p := G_p \setminus \{v_p\}$ , graphs D and E and three huge cliques A, B and C of size S; cliques A, B and C together form a supernode. We keep the edges inside and between D and E and the edges between  $G'_p$  and  $D \cup E$  as they are in G.

We add a complete bipartite graph between cliques B and C, i.e.,  $B \cup C$  forms a clique of size 2S. No vertex in A is connected to B or C. In other words, the supernode is created from a node by replacing each vertex by a clique of size S and the only edge in the node by a complete bipartite graph.

There are no edges between the supernode (cliques A and  $B \cup C$ ) and any precolored vertex in  $G'_p$ . It remains to add edges between the supernode and  $D \cup E$ . There is an edge between each vertex in E and each vertex in the supernode, while every vertex in D is connected only to the whole A and B, but not to any vertex in C. The fact that D and C are not adjacent at all is essential in our analysis. Our construction is depicted in Figure 4.



Figure 4: An illustration of our construction of G' where parts A, B and C form a supernode and parts D and E form the original graph G (the remaining precolored vertices are not shown). A thick line connecting two parts of G' corresponds to a complete bipartite graph between them. The edges between D and E remain unchanged from the original graph G. If there is no line between two parts, then there is no edge between them in G'.

Proof of Lemma 4.1. Let G' be the graph defined as above. Note that the number of vertices in G' is at most 25|V(G)|, G' can be constructed from G in polynomial time and G' has only  $|V(G_p)| - 1$  precolored vertices. Therefore, it remains to prove  $\chi^O(G') \leq k'$  for some k' if and only if  $\chi^O(G) \leq k$ . We set k' to k + 2S, since at most 2S colors will be used in the supernode.

We start with the "only if" direction which is easier. Suppose that  $\chi^O(G) > k$  and consider G' constructed from G. DRAWER starts by sending A and then  $B \cup C$  such that no color is both in A and in B; this is possible, since cliques A and C have the same size. More precisely, if PAINTER would assign a color from A to a vertex from  $B \cup C$ , DRAWER decides that the vertex

is in C; otherwise the vertex is in B (or in C if every vertex in B has been colored). This forces PAINTER to use 2S different colors on A and B and no such color can be used for D and E.

Now the colored part of G' (precolored vertices and the supernode) may be viewed as a precolored part in G except that PAINTER may not be able to use the supernode in the same way as a precolored vertex. Since this only helps DRAWER, DRAWER sends vertices according to its winning strategy for G. This proves the "only if" direction of the third proposition of Lemma 4.1.

In the rest of this section we focus on the opposite direction: assuming that  $\chi^O(G) \leq k$ , we show that PAINTER can color G' with k' colors regardless of the strategy of DRAWER.

In the following, when we refer to the colored part of G', we do not take precolored vertices into account. PAINTER actually does not look at precolored vertices unless it uses its winning strategy for coloring G with k colors.

**Intuition.** At the beginning PAINTER has too little data to infer anything about the vertices. Therefore, PAINTER shall wait for two nonadjacent vertices from D and for two large cliques (larger than S/2) with a small intersection. Before such vertices arrive, it will color greedily.

Note that the greedy coloring algorithm eventually stops before everything is colored. Having two large cliques, one mostly from A and the other mostly from  $B \cup C$ , and two nonadjacent vertices from D, PAINTER is able to recognize where an incoming vertex belongs. Therefore, PAINTER can use the supernode like a precolored vertex and colors the remaining vertices from D and E by its original winning strategy on G.

This approach may fail if a part of D is already colored by PAINTER's application of the greedy strategy. To remedy this, we prove that colors used on D so far are also used in C or E, or will be used on C later.

The other obstacle is that PAINTER might not be able to distinguish between one clique from D and vertices in A if nothing from B arrives. Nevertheless, each vertex u in such a "hidden" clique is connected to all other colored vertices in D and to the whole colored part of E, otherwise it would be distinguishable from vertices in A. Hence, it does not matter which color u receives (since it is universal to colored vertices in D and E).

In summary, the sheer size of the supernode should allow the player PAINTER to be able to use it as if it were precolored. Still, we need to allow for some small margin of error. This leads us to the following definition:

**Definition 4.** Let N be the number of vertices of  $D \cup E$  as in the construction of G'. For subgraphs  $X, Y \subseteq G'$ , we say that X is *practically a subgraph* of Y if  $|V(X) \setminus V(Y)| \leq N$ , and X is *practically disjoint* with Y if  $|V(X) \cap V(Y)| \leq N$ .

We also say that a vertex v is *practically universal* to a subgraph  $X \subseteq G'$  if it is adjacent to all vertices in X except at most N of them. Similarly, we say a vertex v is *practically independent* of a subgraph  $X \subseteq G'$  if v has at most N neighbors in X.

At first, the player PAINTER uses the following algorithm for coloring incoming vertices, which stops when it detects two useful vertices  $d_1$  and  $d_2$ :

Algorithm WAITFORD: For an incoming vertex u sent by DRAWER:

- 1. Let  $G'_{\mathbf{R}}$  be the revealed part of G' (i.e., colored vertices and u, but not precolored vertices)
- 2. Find a maximum clique in  $G'_{\mathbf{R}}$  and denote it as  $K_1$ .
- 3. Find a maximum clique in  $G'_{\rm R}$  from those which are practically disjoint with  $K_1$  and denote it as  $K_2$ .
- 4. If  $|K_2| \ge S/2$  and there are two nonadjacent vertices  $d_1$  and  $d_2$  in  $G'_{\rm R}$  which are both not practically universal to  $K_1$  or both not practically universal to  $K_2$ :
- 5. Stop the algorithm.
- 6. Otherwise, color u using FIRSTFIT.

While the algorithm may seem to use a huge amount of computation for one step, we should realize that we are not concerned with time complexity when designing the strategy for PAINTER. In fact, even a non-constructive proof of existence of a winning strategy would be enough to imply existence of a PSPACE algorithm for finding it – we have observed already in Section 1 that ONLINE CHROMATIC NUMBER lies in PSPACE.

Let v be the incoming vertex u when WAITFORD stops; note that v is not colored by the algorithm and v can be from any part of G'.

One of the cliques  $K_1$  and  $K_2$  is practically a subgraph of  $B \cup C$  and we denote this clique by  $K_{BC}$ . The other clique must be practically a subgraph of A and we denote it by  $K_A$ . (Keep in mind that both cliques may contain up to N vertices from  $D \cup E$ .) We remark that some vertices from C must have arrived, as A and B alone are indistinguishable in Step 4 of WAITFORD. By the same argument, the player PAINTER knows whether  $K_1 = K_A$  or  $K_1 = K_{BC}$ .

Let  $d_1$  and  $d_2$  be the nonadjacent vertices that caused the algorithm to stop. We observe that  $d_1, d_2 \in D$  by eliminating all other possibilities:

- Neither  $d_1$  nor  $d_2$  is from E, since any vertex of E is practically universal to both cliques.
- Vertices  $d_1$  and  $d_2$  cannot both be from  $B \cup C$ , nor can both be from A, as they would be adjacent.
- If  $d_1$  is in  $B \cup C$  and  $d_2$  in A (or vice versa), then we have a contradiction with the fact that  $d_1$  and  $d_2$  are not practically universal to the same clique.
- If  $d_1 \in D$  and  $d_2$  would be from A or B (or vice versa), then  $d_1$  and  $d_2$  are adjacent.
- Finally, if  $d_1 \in D$  and  $d_2 \in C$  (or vice versa), then the clique to which they are not practically universal cannot be the same for both, since  $d_1$  is universal to the whole A and  $d_2$  to the whole  $B \cup C$ .

Having cliques  $K_A$  and  $K_{BC}$  and vertices  $d_1, d_2 \in D$ , PAINTER uses the following rules to recognize where an incoming or an already colored vertex u belongs:

- If u is practically universal to both  $K_{BC}$  and  $K_A$ , then  $u \in E$ .
- If u is practically universal to  $K_{BC}$  and practically independent of  $K_A$  and u is adjacent to  $d_1$ , then  $u \in B$ .
- If u is practically universal to  $K_{BC}$  and practically independent of  $K_A$ , but there is no edge between  $d_1$  and u, then  $u \in C$ .
- If u is not practically universal to  $K_{BC}$ , but it is practically universal to  $K_A$ , then  $u \in A$  or  $u \in D$ .
  - Among such vertices, if there is a vertex not adjacent to u or u is not adjacent to a vertex in E or u is adjacent to a vertex in B, then  $u \in D$ ; we say that such u is surely in D.

- Otherwise, the player PAINTER cannot yet recognize whether  $u \in A$  or  $u \in D$ .

The reader should take a moment to verify that indeed, the set of rules covers all possible cases for u.

Let  $\tilde{A}, \tilde{B}, \tilde{C}, \tilde{D}, \tilde{E}$  be the colored parts of G' when WAITFORD stops. We observe that in the last case of the recognition the vertices from  $\tilde{D}$  which are indistinguishable from A form a clique; we denote it by  $K_D$ . Note that all vertices in  $K_D$  are connected to all vertices surely from D that arrived and  $K_D$  contains all vertices in  $\tilde{D}$  that are not surely in D. We stress that PAINTER does not know  $K_D$  or even its size.

Intuition for the next step. To start, we give a few extremal examples of which parts of the graph can be colored when WAITFORD terminates:

- 1. The whole C and the whole A are colored, but only a clique from D is colored.
- 2. Some pairs of nonadjacent vertices in D are colored (or even the whole D) and the whole A is colored, but only S/2 vertices from  $B \cup C$  arrived.
- 3. There are again some pairs of nonadjacent colored vertices in D and now the whole C is colored, but only S/2 vertices from A arrived.

Moreover, in all cases, some part of B and some part of E may also be colored.

Continuing with the intuition, as PAINTER can now recognize the parts of the construction (with an exception of  $K_D$ ), we would like to use the winning strategy for PAINTER on G and FIRSTFIT on the rest. More precisely, PAINTER creates a virtual copy of G, adds vertices into it and simulates the winning strategy on this virtual graph.

Our main problem is that some part of D (namely D) is already colored. We shall prove that if  $\tilde{D}$  is not a clique, PAINTER can ignore colors used in  $\tilde{D}$  (but not the colors that it will use on D), since they are already present in C or E or they may be used later in C. If  $\tilde{D}$  is a clique, it may be the case that C and A arrived completely and have the same colors, thus PAINTER cannot ignore colors used on  $\tilde{D}$ .

Another obstacle in the simulation is  $K_D$ , the hidden part of D. To overcome this, PAINTER tries to detect vertices in  $K_D$  and reclassify them as surely in D. PAINTER shall keep that all vertices in  $K_D$  are connected to all currently colored vertices in D and E, therefore it does not matter which colors vertices in  $K_D$  receive.

When PAINTER discovers a vertex from  $K_D$ , it adds the vertex immediately to its simulation of G. On the other hand, the size of  $K_D$  increases when DRAWER sends a vertex from D which is indistinguishable from A.

After the algorithm WAITFORD finishes, the player PAINTER applies an algorithm which simulates its winning strategy on G and maintains disjoint sets of colors  $\mathcal{C}$  (mainly for the supernode) and  $\mathcal{E}$  (for E and vertices surely in D). Recall that PAINTER is not able to distinguish between A and  $K_D$ , thus vertices in  $K_D$  are treated in the same way as vertices in A. More precisely, we define three color sets  $\mathcal{C}$ ,  $\mathcal{S}$  and  $\mathcal{E}$  as follows:

#### Definition 5.

- If colored vertices surely in D form a clique, let S be the set of colors that are used on a colored vertex surely in D and that are not used in  $\tilde{C}$ . Otherwise, if there are two nonadjacent colored vertices surely in D, let S be an empty set.
- Let C be the set of colors present currently in the supernode or in  $K_D$  and among vertices surely in D (i.e., in  $\tilde{A}, \tilde{B}, \tilde{C}$ , or  $\tilde{D}$ ) except colors from S and colors present also in  $\tilde{E}$ .
- Let  $\mathcal{E}$  be the set of colors assigned to vertices in  $\tilde{E}$  and colors in  $\mathcal{S}$ .

We will update the color sets when we apply our algorithms and as more vertices arrive on input; the precise updating procedure is specified throughout the algorithms. We shall keep that C and  $\mathcal{E}$  are disjoint. The winning algorithm for PAINTER is split into two parts, initialization and coloring:

Algorithm INITSIMULATION:

- 1. PAINTER initializes a virtual graph  $G_{\text{virt}}$  by copying all vertices from  $\tilde{E}$ ; the colors of such vertices are inherited from G'.
- 2. Next, update the virtual graph with vertices surely in D as follows:
- 3. Set an arbitrary (virtual) ordering on already arrived vertices surely in D.
- 4. For every vertex u in the ordering with a color c in G':
- 5. If  $c \in S$ , color u in  $G_{\text{virt}}$  using c.
- 6. Otherwise, color u in  $G_{\text{virt}}$  using a color c' from  $\mathcal{E}$  or a new color c' not used in G' according to the winning strategy. Add c' to  $\mathcal{E}$  if it is not there.

When adding a colored vertex u that is surely in D to the virtual graph  $G_{\text{virt}}$ , if  $c \in S$ , coloring u with c in  $G_{\text{virt}}$  does not harm the winning strategy by the assumptions of Lemma 4.1 — if S is nonempty, colored vertices surely in D form a clique and PAINTER may use any proper coloring for them in the winning strategy. Moreover, some colors may be both in  $\tilde{D}$  and in  $\tilde{E}$ , but the winning strategy still works by the assumptions.

Otherwise, if  $c \notin S$ , u may obtain a different color in  $G_{\text{virt}}$  than in the actual G'.

#### Algorithm COLORBYSIMULATION: For an incoming vertex *u* sent by DRAWER:

- 1. For each vertex w colored with c in G' that is surely in D now, but that was indistinguishable from vertices in A before u arrived (i.e., in  $K_D$  before u arrived):
  - (a) Add w to the virtual graph  $G_{\text{virt}}$ .
  - (b) As all colored vertices in  $G_{\text{virt}}$  are connected to w (otherwise it would not be in  $K_D$ ), w would obtain a new color if we add w to  $G_{\text{virt}}$  and use the winning strategy of PAINTER on  $G_{\text{virt}}$ .
  - (c) If c is not used in C, remove c from C, add c to  $\mathcal{E}$  and color w using c in  $G_{\text{virt}}$ .
  - (d) Otherwise, if c is present in C, color w in  $G_{\text{virt}}$  using a new color c' not contained in  $\mathcal{C}$  and  $\mathcal{E}$  and add c' to  $\mathcal{E}$ . (In this case, w has a different color in G' and  $G_{\text{virt}}$ , but PAINTER pretends that its color is c' for the purpose of simulation and does not use c for vertices in  $D \cup E$  in G'.)
- 2. If u is from C:
  - (a) If there is a color c among vertices surely in D such that  $c \in C$  and c is not present among colored vertices adjacent to u, color u using the smallest such color.
  - (b) Otherwise, if there is a color in C not present among colored vertices adjacent to u, color u using the smallest such color.
  - (c) Otherwise, choose a new color c not contained in  $\mathcal{C}$  and  $\mathcal{E}$ , color u with c, add c to  $\mathcal{C}$ .
- 3. If u is from A or B or from  $K_D$ , i.e., indistinguishable from A:
  - (a) If there is a color in C not present among colored vertices adjacent to u, color u using the smallest such color.
  - (b) Otherwise, choose a new color c not contained in C and  $\mathcal{E}$ , color u with c, add c to C.
- 4. If u is from E or surely from D:
  - (a) The virtual DRAWER sends u to  $G_{\text{virt}}$ . Simulate the winning strategy on  $G_{\text{virt}}$  and color u using a color  $c \in \mathcal{E}$  or a new color c that is not in  $\mathcal{E}$  or  $\mathcal{C}$ ; in the latter case, add c to  $\mathcal{E}$ .
  - (b) Color u in G' using the same color c.

We remark that the first vertex u colored by the algorithm COLORBYSIMULATION is v, the vertex on which WAITFORD stops. In a sense, if  $\tilde{D}$  (the part of D colored by WAITFORD) is not a clique, PAINTER pretends that in  $\tilde{D}$  there are colors from the simulation, not the colors assigned by WAITFORD. Otherwise, if  $\tilde{D}$  is a clique, PAINTER uses colors from G' in  $G_{\text{virt}}$  which may result in renaming the colors in the winning strategy on  $G_{\text{virt}}$ .

Observe that any color used in G' is in  $\mathcal{C}$  or  $\mathcal{E}$  and that these sets of colors are disjoint. Thus the colors used for  $D \cup E$  are different from those in the supernode except colors used in  $\tilde{D}$  or colors of vertices that were in  $K_D$  when they arrived (which may happen also during the execution of COLORBYSIMULATION).

Note that if u is from E or surely from D, coloring with c is sound; this follows from the winning strategy on G and from the fact that colors in  $\mathcal{E}$  are not used in the supernode (recall that colors in  $\mathcal{S}$  are not used in  $\tilde{C}$ ).

The key part of the analysis is captured by the following claim and its proof which explains the design of COLORBYSIMULATION.

#### **Claim 4.2.** For any color $c \in C$ it holds that c is used on a vertex in the supernode.

*Proof.* Any color added to  $\mathcal{C}$  by COLORBYSIMULATION and not removed from  $\mathcal{C}$  in Step 1.(c) is used in the supernode and no color used in E is in  $\mathcal{C}$ , thus it remains to show that any color  $c \in \mathcal{C}$  used in  $\tilde{D}$  (either on a vertex surely from D or on a vertex in  $K_D$  when COLORBYSIMULATION starts) is present in C when the whole G' is colored.

We assume that c is not used in  $G_{\text{virt}}$  and thus also not in  $\tilde{E}$ , otherwise c is not in C. Colors in  $\tilde{D}$  and not in  $G_{\text{virt}}$  (thus also not in S) are in C, thus COLORBYSIMULATION can use c only for a vertex in C. Let u be the first vertex in  $\tilde{D}$  that obtains color c and let t be the time of coloring u.

Note that if u is in  $K_D$  at any time, then we are done, since u becomes surely in D at some time (e.g., when the first vertex from B arrives) and at that time, either c is already used in C, or COLORBYSIMULATION uses c also in  $G_{\text{virt}}$  and removes it from C. Also, if colored vertices surely from D form a clique when COLORBYSIMULATION starts and u is surely in D at that time, then c is either used in  $\tilde{C}$ , or it is in S and thus not in C.

Therefore we assume that u is not in  $K_D$  at any time, thus u is surely in D, and there are two nonadjacent colored vertices surely in D when COLORBYSIMULATION starts. This implies  $|K_{BC}| = |S|/2$  or  $|K_A| = |S|/2$  when COLORBYSIMULATION starts which means that  $|\tilde{C}| \leq |S|/2$  or  $|\tilde{A}| \leq |S|/2$ .

If  $|C| \leq |S|/2 < |S| - N$ , then at least N vertices from C are colored by COLORBYSIMULA-TION. In this case, COLORBYSIMULATION must assign c to a vertex in C at some point, since it prefers colors used in  $\tilde{D}$  before colors in A or new colors and  $N \geq |\tilde{D}|$ .

Otherwise |C| > |S|/2, thus  $|A| \le |S|/2$ . If at time t there is some color in C not used in A, let c' be the smallest such color in the ordering of colors. We observe that WAITFORD uses the color c' for u, since other colors allowed for coloring u are some colors used in E at time t (which we assume that u does not get), or colors in D (which u also does not get as it is the first vertex in D that has color c), or a new color not yet used anywhere, but any new color is after c' in the ordering of colors. Hence the greedy algorithm WAITFORD prefers c' and c = c', thus c is already used in C.

Otherwise, when PAINTER colors u, all colors used in C are also present in A which also means that there are at least as many colored vertices in A as in C at time t. Let r be the number of colored vertices in C at time t. WAITFORD colors more than |S| - N - r vertices from C after time t, at most |S|/2 - r of them are colored by a color already used in A, thus after time t WAITFORD colors more than |S| - N - r - (|S|/2 - r) = |S|/2 - N vertices from C which do not get a color from A. Hence WAITFORD must use c for a vertex in C as  $|S|/2 - N \ge |\tilde{D}|$ . This concludes the proof of the claim.

There are always 2S colors used in the supernode, since otherwise there must be a color c in A that is not in  $B \cup C$ , but both WAITFORD and COLORBYSIMULATION prefer coloring B using colors in A and coloring A using colors from  $B \cup C$ . Thus  $|\mathcal{C}| = 2S$  by Claim 4.2.

Since all colors in  $\mathcal{E}$  are used in the virtual graph  $G_{\text{virt}}$  (this includes also colors in  $\mathcal{S}$ ) and PAINTER uses the winning strategy on  $G_{\text{virt}}$ , we know that  $|\mathcal{E}| \leq k$ . Overall, PAINTER uses at most 2S + k = k' colors and we proved  $\chi^O(G') \leq k'$  if  $\chi^O(G) \leq k$ . This concludes the proof of Lemma 4.1.

#### 4.1 Proof of the main theorem

We show how to apply Lemma 4.1 on the construction from Section 3 and prove the PSPACEcompleteness of ONLINE CHROMATIC NUMBER.

Proof of Theorem 1.1. Let  $\phi$  be a formula of size n. We first construct a graph  $G_2$  with  $p = \mathcal{O}(\log n)$  precolored vertices  $z_1, z_2, \ldots z_p$  as described in Sections 2 and 3. By Lemmas 3.4 and 3.2 we have  $\chi^O(G_2) \leq k'$  if and only if  $\phi$  is satisfiable. Then for each precolored vertex in  $G_2$ , we apply Lemma 4.1 iteratively until we obtain a graph  $G_3$  with no precolored vertex such that  $\chi^O(G_3) \leq k''$  iff  $\phi$  is satisfiable (for some k'').

The number of vertices in  $G_3$  is polynomial in n, because  $G_2$  has linearly many vertices and the number of vertices is multiplied by a constant with each of  $\mathcal{O}(\log n)$  applications of Lemma 4.1. The constructions in Sections 2 and 3 and in Lemma 4.1 yield a polynomial-time algorithm for computing G' from  $\phi$ .

It remains to check the assumption of Lemma 4.1 in each iteration i; we recall it here: If  $\chi^O(G) \leq k$ , then there exists a winning strategy of PAINTER where PAINTER colors E using FIRSTFIT before two nonadjacent vertices from D arrive. Moreover, in this case if FIRSTFIT assigns the same color to a vertex in D and to a vertex in E before two nonadjacent vertices from D arrive, PAINTER can still color G using k colors.

Let  $H_0$  be  $G_2$  and for each iteration i let  $H_{i-1}$  be the graph before removing the i-th precolored vertex  $z_i$  and let  $H_i$  be the graph created from  $H_{i-1}$  by the construction in Lemma 4.1. Let the nonprecolored vertices of  $H_{i-1}$  be partitioned into two disjoint induced subgraphs  $D_i$  and  $E_i$  such that all vertices from  $E_i$  are connected to  $z_i$  and no vertex in  $D_i$  is connected to  $z_i$ . We denote by  $A_i, B_i$  and  $C_i$  the cliques in the supernode in  $H_i$ . Thus  $H_i$  consists of parts  $A_i, B_i, C_i, D_i$ , and  $E_i$  (and possibly some precolored vertices which we do not take into account).

Note that  $E_i$  contains only some nodes and  $D_i$  contains the whole  $G_1$  (i.e.,  $K_{col}$  and the gadgets for variables and clauses) together with supernodes from previous iterations and nodes that are not in  $E_i$ . We also remark that for i > 1 parts  $A_{i-1}, B_{i-1}$ , and  $C_{i-1}$  of  $H_{i-1}$  are in  $D_i$  and that there may be some nodes both in  $D_i$  and in  $E_{i-1}$  and also some nodes both in  $E_i$  and in  $D_{i-1}$ .

We start with the first iteration. The first part of the assumption holds for  $H_0 = G_2$ , since the algorithm GREEDY from the winning strategy from Lemma 3.4 colors the nodes by FIRSTFIT before two nonadjacent vertices from  $G_1$  arrive and  $D_1$  contains  $G_1$ .

For the "moreover" part in the first iteration, if FIRSTFIT assigns the same color c to a vertex d in  $D_1$  and a vertex e in  $E_1$  before two nonadjacent vertices from  $D_1$  arrive, then e must be from a node that identifies d and in this case PAINTER can just pretend that d is an unrecognized vertex. In other words, the color c is intended for nodes and not used in  $G_1$ .

For an iteration i > 1, note that in the winning strategy on  $H_{i-1}$  PAINTER colors  $H_{i-1}$  using FIRSTFIT before two large and practically disjoint cliques from the supernode arrive, one mostly from  $A_{i-1}$  and the other mostly from  $B_{i-1} \cup C_{i-1}$ . Since there are many pairs of nonadjacent vertices between these cliques and these cliques are contained in  $D_i$ , PAINTER can color  $E_i$  using FIRSTFIT before two nonadjacent vertices from  $D_i$  arrive. For the "moreover" part, if FIRSTFIT assigns the same color c to a vertex d in  $D_i$  and a vertex e in  $E_i$  before two nonadjacent vertices from  $D_i$  arrive, then e is from nodes (as  $E_i$  contains only nodes) and d is either from  $G_1$  as in the first iteration, or from the supernode created in the previous iteration; in the latter case, e is in  $D_j$  and d is in  $C_j$  for j < i, since otherwise they would be connected. (Note that d cannot be from nodes, since there is a complete bipartite graph between every two nodes and a node is never split between E and D.) In both cases, this does not harm the winning strategy of PAINTER on  $H_{i-1}$ , because the algorithm COLORBYSIMULATION assumes that FIRSTFIT may use the same colors for more vertices in  $D_{i-1} \cup E_{i-1}$  or in  $D_{i-1} \cup C_{i-1}$ . This concludes that the assumption of Lemma 4.1 is satisfied in each iteration.

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