

Determining a Slater Winner is Complete for Parallel Access to NP

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Abstract

We consider the complexity of deciding the winner of an election under the Slater rule. In this setting we are given a tournament $T = (V, A)$, where the vertices of V represent candidates and the direction of each arc indicates which of the two endpoints is preferable for the majority of voters. The *Slater score* of a vertex $v \in V$ is defined as the minimum number of arcs that need to be reversed so that T becomes acyclic and v becomes the winner. We say that v is a Slater winner in T if v has minimum Slater score in T .

Deciding if a vertex is a Slater winner in a tournament has long been known to be NP-hard. However, the best known complexity upper bound for this problem is the class Θ_2^P , which corresponds to polynomial-time Turing machines with parallel access to an NP oracle. In this paper we close this gap by showing that the problem is Θ_2^P -complete, and that this hardness applies to instances constructible by aggregating the preferences of 7 voters.

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1 Introduction

Voting rules, which are a topic of central interest in computational social choice, are schemes which allow us to aggregate the preferences of a set of voters among a set of candidates, in order to select a single winner who is most compatible with the voters' wishes. The main challenge of this area is that, even if the preferences of each voter are internally consistent (that is, each voter has a complete ranking of all candidates), it is easy to run into situations such as the famous Condorcet paradox where collective preferences are cyclic and hence no clear winner exists. Many rules have therefore been proposed to deal with this situation and select a winner who is as acceptable as possible to as many voters as possible.

In this paper we investigate the computational complexity of a classical and very natural such voting scheme that is often referred to as the Slater rule. Intuitively, the idea of the Slater rule is the following: we consider every possible pair of candidates in our pool a, b and check whether the majority of voters prefers a or b . This allows us to construct a tournament T that depicts the results of each pairwise matchup between candidates. If T is transitive (that is, acyclic), then picking a winner is easy. If not, the Slater rule is that we should select as the winner a candidate who is the winner of a transitive tournament T' that is at minimum edit distance from T . In other words, a candidate c is a Slater winner if the number of pairwise matchups that we need to ignore to make c a clear winner is minimized.

More formally, the problem we consider is defined as follows. We are given a set V of n candidates and the preferences of m voters, where each voter's preferences are given as a total ordering of V . We determine a pair-wise relation on V as follows: for $a, b \in V$ we say that a wins against b if the majority of voters prefers candidate a over candidate b . In this way, assuming that there are no ties (which is guaranteed if the number of voters is odd), we can construct a tournament $T = (V, A)$, where we have the arc $b \rightarrow a$ (that is $(b, a) \in A$) if a wins against b . In this setting, the Slater score of a candidate c is the minimum number of arcs of T that need to be reversed so that T becomes transitive (acyclic) with c being placed last (that is, with c being a sink). The Slater winner of a tournament is a candidate with minimum Slater score. Intuitively, a candidate c is a Slater winner if there exists a linear ordering \prec of the candidates that ranks c as the winner and is as compatible as possible with the voters' aggregated preferences, in the sense that the edit distance between \prec and T is minimum.

The notion of Slater winner is very well-studied and can be seen as a special case of Kemeny voting. Indeed, in Kemeny voting we construct a weighted tournament where the weight of the arc $b \rightarrow a$ denotes the margin of victory of a over b . In this sense, the Slater system corresponds to a version of Kemeny voting where we only retain as information which of the two candidates would win a head-to-head match-up, but ignore the margin of victory. In other words, Slater voting is the special case of Kemeny voting where the arcs are unweighted. For more information about these and other related voting systems, we refer the reader to [5].

The main question we are interested in in this paper is the computational complexity of determining if a vertex v of a tournament is a Slater winner. It has long been known that this question is at least NP-hard [15]. Indeed, it is not hard to see that if we had an oracle for the Slater problem we would be able to produce in polynomial time an ordering of any tournament in a way that minimizes the number of inversed arcs. This would solve the FEEDBACK ARC SET problem, which is known to be NP-complete on tournaments [1, 2, 7, 9]. On the other hand, membership of this problem in NP is not obvious. The best currently known upper bound on its complexity is the class Θ_2^P , shown by Hudry [8, 15].

The class Θ_2^p seems like a natural home for the Slater problem. As a reminder, this class captures as a model of computation polynomial-time Turing machines which are allowed to use an NP oracle either a polynomial number of times non-adaptively (that is, with questions not being allowed to depend on previous answers), or a logarithmic number of times adaptively. Hence, this class is often called “Parallel Access to NP” and written as $P_{||}^{\text{NP}}$. Intuitively, solving the Slater problem requires us to calculate exactly a value that is NP-hard to compute (the minimum feedback arc set of a tournament). This can be done either by asking polynomially many non-adaptive NP queries to an oracle (for each $k = 1, 2, \dots$ we ask if the feedback arc set has size at most k), or a logarithmic number of adaptive queries (where we essentially perform binary search). It has therefore been conjectured that determining if a candidate is a Slater winner is not just NP-hard, but Θ_2^p -complete [4, 5, 15]. We recall that Θ_2^p is strongly suspected to be a much larger class than NP – indeed, because Θ_2^p contains all of the so-called Boolean hierarchy of classes, it is known that if it were the case that $\Theta_2^p = \text{NP}$, then the polynomial hierarchy would collapse [6]. Hence, the difference between the known upper and lower bounds on the complexity of determining a Slater winner is not trivial.

The result we present in this paper settles this problem. We confirm the conjecture that determining the Slater winner of a tournament is indeed Θ_2^p -complete. This places Slater voting in the same class as related voting schemes, such as Kemeny [14], Dodgson [12], and Young [16]. It also places it in the same class as the Slater rule used in [11] for a more general judgment aggregation problem. We prove this result by modifying the reduction of Conitzer [9], which showed that FEEDBACK ARC SET on tournaments is NP-complete. The main difference is that, rather than reducing from SAT, we need to reduce from a Θ_2^p -complete variant, where we are looking for a maximum weight satisfying assignment that sets a certain variable to True. This forces us to significantly complicate the reduction because we need to encode in the objective function not only the number of satisfied clauses but also the weight of the corresponding assignment.

Having settled the worst-case complexity of the problem in general, we go on to consider a related question: what is the minimum number of voters for which determining a Slater winner is Θ_2^p -complete? The motivation behind this question is that, even though any tournament can be constructed by aggregating the preferences of a large enough number of voters¹, if the number of voters is limited, some tournaments can never arise. Hence the problem may conceivably be easier if the number of voters is bounded. In the case of the Slater rule, Bachmeier et al.[3] have shown that determining the Slater winner remains NP-hard for 7 voters. By reusing and slightly adjusting their arguments we improve their complexity lower bound to Θ_2^p -completeness for 7 voters.

2 Definitions and Preliminaries

A tournament is a directed graph $G = (V, A)$ such that for all $x, y \in V$, exactly one of the arcs $(x, y), (y, x)$ appears in A . A feedback arc set (fas) of a digraph $G = (V, A)$ is a set of arcs $A' \subseteq A$ such that deleting A' from G results in an acyclic digraph. If G is a tournament and A' is a fas of G , then the tournament obtained from G by reversing the direction of all arcs of A' is acyclic (or transitive). We will say that a total ordering \prec of the vertices of a digraph $G = (V, A)$ *implies* the fas $S = \{(x, y) \mid (x, y) \in A, y \prec x\}$ (in the sense that S is

¹ This is a classical result known in the literature as McGarvey’s theorem.

the set of arcs that disagree with the ordering). We will say that an ordering of V is optimal if the fas it implies has minimum size.

Given a digraph $G = (V, A)$ and $v \in V$, we say that v is a Slater winner if for some $k \geq 0$ the following hold: (i) there exists a fas $S \subseteq A$ of G , such that v is a sink of $G - S$ and $|S| = k$ (ii) every fas of G has size at least k . If v is a Slater winner in $G = (V, A)$, then a winning ordering for v is a linear ordering of V that places v last and implies a fas of G of minimum size.

In a digraph $G = (V, E)$, a set $M \subseteq V$ is a module if the following holds: for all $x, y \in M$ and $z \notin M$ we have $(x, z) \in A \leftrightarrow (y, z) \in A$ and $(z, x) \in A \leftrightarrow (z, y) \in A$. In other words, every vertex outside M that has an arc to (respectively from) a vertex of M , has arcs to (respectively from) all of M . The following lemma, given by Conitzer [9] with slightly different terminology, states that the vertices of a module can, without loss of generality, always be ordered together. We say that the vertices of a set S are contiguous in an ordering \prec if there are no $x, y \in S$, $z \notin S$ such that $x \prec z \prec y$.

► **Lemma 1.** *Let $G = (V, A)$ be a digraph, $v \in V$ a vertex, and suppose we have a partition of V into k non-empty modules $V = M_1 \uplus M_2 \uplus \dots \uplus M_k$. If v is a Slater winner of G , then there exists a winning ordering for v such that for all $i \in [k]$, the vertices of M_i are contiguous.*

2.1 Complexity

We recall the class Θ_2^p which is known to have several equivalent characterizations, including $P^{\text{NP}[\log n]}$ (P with the right to make $O(\log n)$ queries to an NP oracle), L^{NP} (logarithmic-space Turing machines with access to an NP oracle), and $P_{\parallel}^{\text{NP}}$ (P with parallel non-adaptive access to an NP oracle). We refer the reader to [13] for more information on this class. In [17] it was shown that the following problem is Θ_2^p -complete: given a graph G , is the maximum clique size $\omega(G)$ odd? In [10] it is mentioned that the following problem, called MAX MODEL, is Θ_2^p -complete: given a satisfiable CNF formula ϕ containing a special variable x , is there a satisfying assignment of ϕ that sets x to True and has maximum Hamming weight (among all satisfying assignments), where the Hamming weight of an assignment is the number of variables it sets to True.

We will use as a starting point for our reduction a variant of MAX MODEL which we show is Θ_2^p -complete below. The main difference between this variant and the standard version is that we assume that the given formula is satisfied by the assignment that sets all variables to False.

► **Lemma 2.** *The following problem is Θ_2^p -complete. Given a 3-CNF formula ϕ containing a distinguished variable x , such that ϕ is satisfied by the all-False assignment, decide if there exists a satisfying assignment for ϕ that sets x to True and has maximum weight among all satisfying assignments.*

Proof. We start with a graph $G = (V, E)$ for which the question is if the maximum independent set has odd size (clearly this is equivalent to the question of deciding if the maximum clique has odd size by taking the complement of G , so our starting problem is Θ_2^p -complete [17]). Let $|V| = n$ and suppose $V = \{v_1, \dots, v_n\}$. We construct a formula ϕ as follows: for each $i \in \{1, \dots, n\}$ we build $(n+1)$ variables x_i^1, \dots, x_i^{n+1} and for each $j, k \in \{1, \dots, n+1\}$ we add the clause $(x_i^j \rightarrow x_i^k)$; for each $(v_{i_1}, v_{i_2}) \in E$, for each $j, k \in \{1, \dots, n+1\}$ we add the clause $(\neg x_{i_1}^j \vee \neg x_{i_2}^k)$; we construct n variables y_1, \dots, y_n and clauses that represent the constraints $(y_1 = x_1^1)$, and for each $i \in \{2, \dots, n\}$, $(y_i = y_{i-1} \oplus x_i^1)$. We

set y_n as the distinguished variable of ϕ . The formula construction can clearly be carried out in polynomial time, and no clause has size more than three. Furthermore, setting everything to False satisfies all clauses. Intuitively, for each vertex we have constructed $n + 1$ variables that will be set to True if we take this vertex in the independent set. The first set of clauses ensures that we make a consistent choice among the copies; the second set that we indeed select an independent set; and the third calculates the parity of its size.

We now observe that independent sets S of G naturally correspond to satisfying assignments of ϕ . In particular, given an independent set $S \subseteq V$ we can construct an assignment by setting, for all i, j , x_i^j to True if and only if $v_i \in S$; we then complete the assignment by giving appropriate values to the y_i variables so that the parity constraints are satisfied. For the converse direction, we can extract an independent set S from a satisfying assignment by setting $v_i \in S$ if and only if the assignment sets x_i^1 to True. We observe the y_n is set to True in a satisfying assignment if and only if the corresponding independent set has odd size (indeed, for each i , y_i is set to True if the intersection of the independent set with the first i vertices has odd size).

Suppose now that there exists an independent set S of maximum size k and that k is odd. Then, there exists a satisfying assignment of maximum weight that sets y_n to True. Indeed, suppose for contradiction that the maximum satisfying assignment σ sets y_n to False. Then, the corresponding independent set S' must have even size k' . Since k is odd and S is a maximum independent set, $k' < k$. But then, the weight of σ is at most $k'(n + 1) + n < k(n + 1)$. However, the assignment corresponding to S has weight at least $k(n + 1)$, contradiction.

For the converse direction, suppose there exists a satisfying assignment σ of maximum weight that sets y_n to True. The corresponding independent set S has odd size, say $|S| = k$. If there exists a maximum independent set S' that has even size k' , then $k' > k$. However, the corresponding truth assignment σ' would have weight at least $k'(n + 1) > k(n + 1) + n$. Since σ has weight at most $k(n + 1) + n$ we get a contradiction to the optimality of σ .

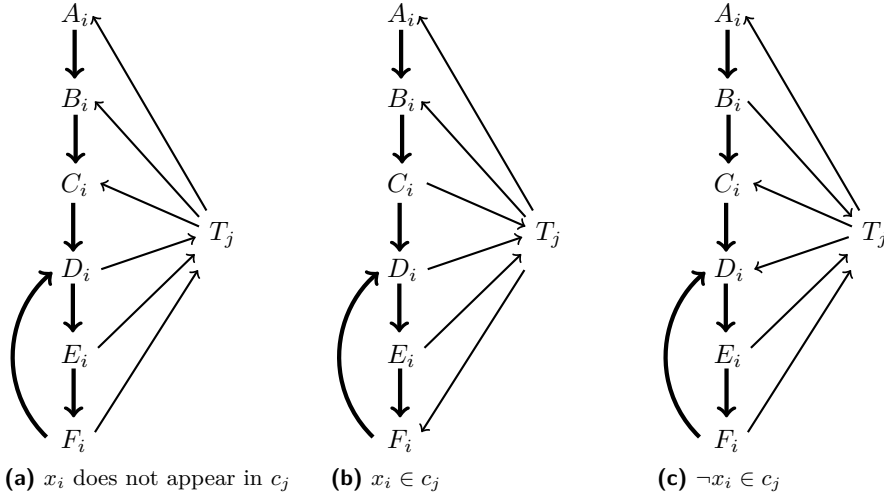
We conclude that there is a satisfying assignment to ϕ of maximum weight that sets y_n to True if and only if the maximum independent set of G has odd size. ◀

3 Reduction to Slater

This section presents the main result of the paper, stated in Theorem 3. The theorem is based on a reduction from the problem of Lemma 2 to the problem of deciding if a vertex of a tournament is a Slater winner. Before we dive into the proof, let us give some high level intuition (we also invite the reader to take a look at Figure 1).

We will build a tournament to represent a CNF formula ϕ with n variables and m clauses by constructing n groups of “large” modules $(A_i, B_i, C_i, D_i, E_i, F_i, \text{ for } i \in \{1, \dots, n\})$ and m “small” modules T_j for $j \in \{1, \dots, m\}$. The internal structure of the modules will be irrelevant and we only care about their ordering, which we may assume to be contiguous thanks to Lemma 1. We will make sure to adjust the sizes of the modules and their connections so that we have the following properties:

1. In any reasonable ordering, all six modules representing variable x_i come before the six modules representing x_{i+1} . This will naturally order the large modules into n sections.
2. Inside a section, any reasonable ordering will place A_i, B_i, C_i first. Then, if the remaining modules are ordered $D_i \prec E_i \prec F_i$, this encodes that x_i is set to True.
3. Connections between T_j and variable modules will be such that if T_j is placed completely before or completely after the section of a variable x_i , then the cost is the same. However,



■ **Figure 1** Gadgets of the reduction of Theorem 3. On the left of each figure the six large modules $A_i, B_i, C_i, D_i, E_i, F_i$ represent the variable x_i . Missing (thick) arcs go downwards, so the ordering is forced except for the last three modules. The depicted ordering $D_i \prec E_i \prec F_i$ encodes that x_i is True. In the three figures we depict the connections between the six modules and the small module T_j representing clause c_j depending on whether x_i appears in c_j . In the first case placing T_j anywhere costs at least three arcs. In the second case, placing T_j after E_i costs two arcs, because setting x_i to True satisfies c_j . In the last case, a similarly advantageous placement could be obtained by using the ordering $E_i \prec F_i \prec D_i$ (which encodes that x_i is False) and putting T_j before D_i .

the cost may be lower if T_j is placed inside the section of x_i . In that case, we must check if x_i appears in the clause c_j in the original formula and the ordering of the section of x_i encodes an assignment to x_i that satisfies c_j .

4. Variable modules are so large that the ordering must always encode a satisfying assignment to the formula (which exists by assumption). The ordering of T_j modules among themselves is irrelevant.
5. In order to encode the weight of a satisfying assignment, we make E_i modules slightly larger (we add 2 extra vertices). Then, the ordering $D_i \prec E_i \prec F_i$, which encodes that x_i is True, is better than other orderings that encode satisfying assignments. Hence, the optimal ordering will represent a satisfying assignment to ϕ with maximum weight.
6. Finally, in order to encode that there is a special variable x_n which must be set to True, we add one extra vertex to E_n . This makes sure that setting x_n to True is more advantageous than setting any other variable to True, but not more advantageous than setting two other variables to True.

Armed with the intuition of the previous list, we are now ready to present all the details of our reduction.

► **Theorem 3.** *The following problem is Θ_2^P -complete: given a tournament $T = (V, A)$ and a vertex $v \in V$, decide if v is a Slater winner.*

Proof. We perform a reduction heavily inspired by the reduction of [9] proving that computing the minimum fas of a tournament is NP-complete, though we include a minor modification proposed by Bachmeier et al. [3] which will later allow us to show that our instances are realizable using seven voters. The main complication compared to the reductions of [9, 3] is that we now need to encode the CNF formula in a way that satisfying assignments of larger weight correspond to orderings with better objective value.

We start with a formula ϕ , as given in Lemma 2. Let x_1, \dots, x_n be the variables of ϕ and suppose that the question is whether there exists a satisfying assignment of maximum weight that sets x_n to True. Recall that by assumption the all-False assignment satisfies ϕ . Let m be the number of clauses of ϕ .

We define two numbers s_1, s_2 which satisfy the following properties:

$$s_1^2 > (3n - 1)ms_1s_2 + 3ns_1 + m^2s_2^2 + 9m(n - 1)s_2 \quad (1)$$

$$s_1s_2 > 3ns_1 + m^2s_2^2 + 9m(n - 1)s_2 \quad (2)$$

$$s_1 > m^2s_2^2 + 9m(n - 1)s_2 \quad (3)$$

For concreteness, set $s_2 = (n + m)^5$ and $s_1 = s_2^5 = (n + m)^{25}$ and the above inequalities are easily satisfied when $n + m$ is sufficiently large. Importantly, s_1, s_2 are polynomially bounded in $n + m$. Intuitively, the idea is that s_1, s_2 are two very large numbers, and s_1 is significantly larger. We will construct modules of size (roughly) s_1 or s_2 , and the values are chosen so that arcs between large modules will be very important, arcs between large and small modules quite important, and arcs between small modules almost irrelevant.

We now construct our tournament as follows: for each $i \in \{1, \dots, n\}$ we construct 6 modules, call them $A_i, B_i, C_i, D_i, E_i, F_i$. Modules A_i, B_i, C_i, D_i, F_i have size s_1 , while modules E_i have size $s_1 + 2$ if $i < n$, and the size of E_n is $s_1 + 3$. Internally, each of these modules induces a transitive tournament. For $i < j$ we add all arcs from $A_i \cup B_i \cup C_i \cup D_i \cup E_i \cup F_i$ to $A_j \cup B_j \cup C_j \cup D_j \cup E_j \cup F_j$. For each $i \in \{1, \dots, n\}$ we add all possible arcs (i) from A_i to $B_i \cup C_i \cup D_i \cup E_i \cup F_i$ (ii) from B_i to $C_i \cup D_i \cup E_i \cup F_i$ (iii) from C_i to $D_i \cup E_i \cup F_i$ (iv) from D_i to E_i (v) from E_i to F_i (vi) from F_i to D_i . The graph we have constructed so far is a tournament with n sections, each made up of 6 modules. Each such section represents a variable x_i and the sections are linearly ordered. The structure inside each section is essentially the transitive closure of $A_i \rightarrow B_i \rightarrow C_i \rightarrow D_i \rightarrow E_i \rightarrow F_i$ with the exception that arcs between D_i and F_i are heading towards D_i .

We now complete the construction by adding to the current tournament some vertices that represent the clauses of ϕ . In particular, for each $j \in \{1, \dots, m\}$ we construct a module T_j of size s_2 to represent the j -th clause of ϕ . Internally, T_j is a transitive tournament. For $j, j' \in \{1, \dots, m\}$, the arcs between T_j and $T_{j'}$ are set in an arbitrary direction. What remains is to explain how the arcs between T_j and the modules representing the variables are set so as to encode the incidence of variables with clauses. For each $i \in \{1, \dots, n\}$ and $j \in \{1, \dots, m\}$ we do the following:

1. If x_i does not appear in the j -th clause we add all arcs from T_j to $A_i \cup B_i \cup C_i$ and all arcs from $D_i \cup E_i \cup F_i$ to T_j .
2. If x_i appears positive in the j -th clause we add all arcs from T_j to $A_i \cup B_i \cup F_i$ and all arcs from $C_i \cup D_i \cup E_i$.
3. If x_i appears negative in the j -th clause we add all arcs from T_j to $A_i \cup C_i \cup D_i$ and all arcs from $B_i \cup E_i \cup F_i$.

This completes the construction and the question we want to answer is whether the last vertex (that is, the sink) of the transitive tournament induced by F_n is a Slater winner of the whole graph.

We need to prove that the designated vertex is a Slater winner if and only if there is a satisfying assignment for ϕ with maximum weight that sets x_n to True. We will do this by establishing some properties regarding any optimal ordering of the constructed tournament, showing that such an ordering must always have a structure which implies a

satisfying assignment of ϕ with maximum weight. We will rely heavily on Lemma 1, since the tournament we have constructed can be decomposed into $6n + m$ modules, namely, A_i, B_i, C_i, D_i, E_i , and F_i , for $i \in \{1, \dots, n\}$, and T_j , for $j \in \{1, \dots, m\}$. We therefore assume without loss of generality that these sets are placed contiguously in an optimal ordering.

Let us first argue that any optimal ordering must have some desirable structure which necessarily encodes a satisfying assignment for ϕ . To do this it will be helpful to start with a baseline ordering and calculate its implied fas, as then any ordering which implies a larger fas will be necessarily suboptimal. Consider the ordering which is defined as $A_i \prec B_i \prec C_i \prec E_i \prec F_i \prec D_i$ for each $i \in \{1, \dots, n\}$ and which sets $D_i \prec A_{i+1}$, where each module is internally ordered in the optimal way. We insert into this ordering of the modules that represent variables, the modules T_j as follows: for each $j \in \{1, \dots, m\}$, we find a variable x_i that appears negative in the j -th clause (such a variable must exist, since ϕ is satisfied by the all-False assignment), and place all of T_j between F_i and D_i . If for some pair $T_j, T_{j'}$ their relative ordering is not yet fully specified, we order them in some arbitrary way.

The arcs incompatible with the above ordering are (i) the at most $ns_1(s_1 + 3)$ arcs going from a module D_i to a module E_i (ii) for each T_j that was placed between F_i and D_i we have $2s_1s_2$ arcs (towards $A_i \cup C_i$), as well as at most $3(s_1 + 3)s_2$ arcs to each other group $A_{i'} \cup B_{i'} \cup C_{i'} \cup D_{i'} \cup E_{i'} \cup F_{i'}$, for $i' \neq i$ (iii) the total number of arcs between modules T_j is at most $m^2s_2^2$. Therefore, we have that the fas implied by this ordering has size at most

$$\begin{aligned} B &\leq ns_1(s_1 + 3) + m(2s_1s_2 + 3(n - 1)(s_1 + 3)s_2) + m^2s_2^2 = \\ &= ns_1^2 + (3n - 1)ms_1s_2 + 3ns_1 + m^2s_2^2 + 9m(n - 1)s_2 \end{aligned}$$

In the remainder we will therefore only consider orderings which imply a fas of size at most B , as other orderings are suboptimal. This allows us to draw some conclusions regarding the structure of an optimal ordering. First, observe that for each $i \in \{1, \dots, n\}$, any ordering of $D_i \cup E_i \cup F_i$ will contribute at least s_1^2 arcs to the fas. Using inequality (1), we have that there are at most n pairs of ‘‘large’’ modules (that is, modules of size at least s_1) which are incorrectly ordered, that is, ordered so that all arcs between the modules are included in the fas. Indeed, if there are $n + 1$ such pairs, the fas will have size at least $(n + 1)s_1^2 > B$. We conclude that regarding the $6n$ large modules we must have the following ordering:

1. For each $i < j$, we have that all vertices of $A_i \cup B_i \cup C_i \cup D_i \cup E_i \cup F_i$ (the section that represents the variable x_i) are before all vertices of $A_j \cup B_j \cup C_j \cup D_j \cup E_j \cup F_j$ (the section that represents the variable x_j).
2. For each $i \in \{1, \dots, n\}$, we have $A_i \prec B_i \prec C_i$ and all vertices of $A_i \cup B_i \cup C_i$ are before $D_i \cup E_i \cup F_i$.
3. For each $i \in \{1, \dots, n\}$ we have $D_i \prec E_i \prec F_i$, or $E_i \prec F_i \prec D_i$, or $F_i \prec D_i \prec E_i$.

We would now like to construct a correspondence between assignments to ϕ and orderings of the tournament that respect the above conditions. On the one hand, if we are given an assignment σ we construct an ordering of the variable sections as above and for each i , if σ set x_i to True we set $D_i \prec E_i \prec F_i$, otherwise we set $E_i \prec F_i \prec D_i$. In the converse direction, given an ordering that respects the above conditions (which any optimal ordering must do), we extract an assignment by setting, for each i , x_i to True if and only if $D_i \prec E_i \prec F_i$.

We now argue that the assignment corresponding to an optimal ordering must also be satisfying for ϕ , as otherwise the fas will have size strictly larger than B , contradicting the optimality of the ordering. For the sake of contradiction, suppose we have an optimal ordering which corresponds to an assignment falsifying a clause. As argued above, there

are at least ns_1^2 arcs in the fas contributed by the ordering of the large modules, so we concentrate on the modules T_j representing clauses. A module T_j representing any clause must be incident on at least $(3n-1)s_1s_2$ arcs of the fas connecting it to large modules. To see this, consider the following: we will say that T_j is in the interior of section i , if $A_i \prec T_j$ and T_j is placed before one of D_i, E_i , or F_i . T_j can be in the interior of at most one section i , so for each $i' \neq i$ we observe that at least $3s_1s_2$ arcs incident on T_j and modules of the group i' are in the fas. This gives $3(n-1)s_1s_2$ arcs. In addition, no matter where we place T_j in the interior of section i , at least a further $2s_1s_2$ arcs of the fas are obtained: if T_j is after C_i , then we get the arcs to $A_i \cup B_i$ or the arcs to $A_i \cup C_i$; if T_j is between A_i and C_i , we get the arcs to A_i and at least $2s_1s_2$ arcs from $D_i \cup E_i \cup F_i$. Hence, we get at least $(3n-1)s_1s_2$ arcs in the fas for each T_j .

Furthermore, suppose that the assignment corresponding to the ordering does not satisfy the j -th clause. Then, we claim that at least $3ns_1s_2$ arcs connecting T_j to large modules are included in the fas. Indeed, if T_j is in the interior of section i , it can either be before or after C_i . If it is before C_i , as we observed in the previous paragraph, we always have at least $3s_1s_2$ arcs in the fas between T_j and the large modules of section i . If T_j is placed after C_i , we have the following cases: (i) if x_i does not appear in the clause, then at least $3s_1s_2$ arcs between T_j and the large modules of section i are in the fas (ii) if x_i appears positive in the j -th clause, we know that F_i is not placed last in section i (otherwise the assignment would satisfy the j -th clause), so wherever we place T_j , at least $3s_1s_2$ arcs are included in the fas (iii) similarly if x_i appears negative, since the assignment does not satisfy the clause, F_i is last, so again at least $3s_1s_2$ arcs are included in the fas.

From the above calculations, if the assignment that corresponds to an ordering falsifies a clause, the fas has size at least $ns_1^2 + (m-1)(3n-1)s_1s_2 + 3ns_1s_2 = ns_1^2 + (3n-1)ms_1s_2 + s_1s_2 > B$, where we used inequality (2). We conclude that an optimal ordering must correspond to a satisfying assignment.

We now need to argue that the assignment corresponding to an optimal ordering of the tournament must be a satisfying assignment of maximum weight. Suppose for contradiction that the assignment corresponding to an optimal ordering, call it σ_1 , sets k variables to True, but there exists another satisfying assignment, call it σ_2 , that sets at least $k+1$ variables to True. We will show that starting from σ_2 we can obtain a better ordering of the tournament, contradicting the optimality of the original ordering.

We claim that the ordering from which we extracted σ_1 includes at least $ns_1^2 + (3n-1)ms_1s_2 + 2(n-k)s_1$ arcs in the fas. This is because in the section corresponding to the $n-k$ variables that σ_1 sets to False, either the arcs from E_i to F_i , or the arcs from D_i to E_i are in the fas (since F_i is not placed last in the section), and these are at least $s_1(s_1+2) = s_1^2 + 2s_1$ arcs.

We construct an ordering from σ_2 as follows: we order the variable section in the normal way and inside each section, if $\sigma_2(x_i) = \text{True}$ we use the ordering $D_i \prec E_i \prec F_i$, otherwise we use the ordering $E_i \prec F_i \prec D_i$. For each T_j , we find a variable x_i that satisfies the j -th clause and place T_j in section i immediately before the last module of this section. If for j, j' the order of $T_j, T_{j'}$ is not implied by the above, we set it arbitrarily. The fas implied by this ordering has size at most

$$\begin{aligned} B' &\leq ns_1^2 + 2(n-k-1)s_1 + s_1 + m(2s_1s_2 + 3(n-1)(s_1+3)s_2) + m^2s_2^2 = \\ &= ns_1^2 + 2(n-k)s_1 + (3n-1)ms_1s_2 - s_1 + m^2s_2^2 + 9m(n-1)s_2 \end{aligned}$$

Here, the calculations for the terms $m(2s_1s_2 + 3(n-1)(s_1+3)s_2) + m^2s_2^2$ are the same

as in the calculation of B ; the term $2(n-k-1)s_1$ takes into account that there are $n-k-1$ sections that correspond to variables set to False; and the s_1 term is due to the fact that x_n may be one of the variables set to False and E_n has size s_1+3 and not s_1+2 . Using inequality (3) we have that $-s_1 + m^2s_2^2 + 9m(n-1)s_2 < 0$, so the ordering we have constructed from σ_2 is better than the one from which we extracted σ_1 , contradiction.

At this point we are almost done because we have argued that an optimal ordering of the tournament corresponds to a satisfying assignment of maximum weight and furthermore, since the correspondence sets x_n to True if and only if F_n is the last module in the ordering, the sink of F_n will be last in the ordering if and only if the assignment sets x_n to True. However, ϕ could have several satisfying assignments of the same weight, and since we have set arcs between T_j modules arbitrarily, it could be the case that a maximum weight assignment that sets x_n to False results in a better ordering, making another vertex the Slater winner. This is the reason why we have set E_n to be slightly larger than all other modules E_i , so that setting x_n to True is always slightly more advantageous than setting any other variable to True.

Concretely, we argue the following: any optimal ordering of the tournament corresponds to a satisfying assignment of ϕ with maximum weight; and furthermore if a satisfying assignment of ϕ with maximum weight sets x_n to True, then any optimal ordering places F_n last. We need to argue the second claim, so suppose for contradiction that an optimal ordering does not place F_n last and that the assignment that corresponds to this ordering is σ_1 . Furthermore, suppose that there exists a satisfying assignment σ_2 of maximum weight that sets x_n to True. Say that both σ_1, σ_2 set k variables to True.

We first observe that the ordering from which we extracted σ_1 implies a fas of size at least $ns_1^2 + 2(n-k)s_1 + s_1 + (3n-1)ms_1s_2$. This is because there are $(n-k-1)$ sections where the fas contains $s_1(s_1+2)$ arcs incident on a module E_i , k sections where the fas contains s_1^2 arcs incident from F_i to D_i , and in the section corresponding to x_n the fas contains $s_1(s_1+3)$ arcs, incident on E_n .

On the other hand, if we construct an ordering from σ_2 in the same way as we did previously, the fas obtained will have size at most

$$\begin{aligned} B'' &\leq ns_1^2 + 2(n-k)s_1 + m(2s_1s_2 + 3(n-1)(s_1+3)s_2) + m^2s_2^2 = \\ &= ns_1^2 + 2(n-k)s_1 + (3n-1)ms_1s_2 + m^2s_2^2 + 9m(n-1)s_2 \end{aligned}$$

Again, using inequality (3) which states that $s_1 > m^2s_2^2 + 9m(n-1)s_2$ we conclude that the new ordering is better, contradicting the optimality of the original ordering.

We now summarize our arguments: we have shown that any optimal ordering of the tournament always corresponds to a maximum weight satisfying assignment of ϕ and furthermore, it corresponds to a maximum weight satisfying assignment that sets x_n to True if this is possible; furthermore, if an optimal ordering corresponds to an assignment that sets x_n to True then the last vertex of F_n is a Slater winner. We therefore have two cases: if the last vertex of F_n is a Slater winner, then since optimal orderings give rise to satisfying assignments of maximum weight, there is a maximum weight satisfying assignment of ϕ setting x_n to True; if the last vertex of F_n is not a Slater winner, then the maximum weight satisfying assignment we extract from an optimal ordering sets x_n to False, and there is no satisfying assignment of the same weight setting x_n to True. We conclude that determining if a vertex is a Slater winner is equivalent to deciding if ϕ has a maximum weight satisfying assignment setting x_n to True, and is therefore Θ_2^p -complete. \blacktriangleleft

4 Hardness for 7 Voters

In this section we show that the tournaments constructed in Theorem 3 correspond to instances that could result from the aggregation of the preferences of 7 voters and as a result the problem of determining a Slater winner remains Θ_2^p -complete even for 7 voters. Our approach follows along the lines of the arguments of Bachmeier et al. [3] who proved that determining the Slater winner is NP-hard for 7 voters. Indeed, the proof of [3] consists of an analysis (and tweak) of the construction of Conitzer [9] which establishes that the instances of the reduction can be built by aggregating 7 voter profiles. Since our reduction is very similar to Conitzer's, we essentially only need to adjust the arguments of Bachmeier et al. to obtain Θ_2^p -completeness.

Our first step is to slightly restrict the Θ_2^p -complete problem that is the starting point of our reduction. We present the following strengthening of Lemma 2, which is similar to the problem used as a starting point in the reduction of [3].

► **Lemma 4.** *The problem given in Lemma 2 remains Θ_2^p -complete under the following additional restrictions: (i) we are given a partition of the clauses of ϕ in two sets L, R and each variable appears in at most one clause of L and in at most two clauses of R (ii) each literal appears at most once in a clause of R .*

We now obtain the result of this section by starting the reduction of Theorem 3 from the problem of Lemma 4. In the statement of the theorem below, when we say that a tournament $T = (V, A)$ can be obtained from 7 voters, we mean that there exist 7 total orderings of V such that for all $(a, b) \in A$ we have that $a \prec b$ in at least 4 of the orderings.

► **Theorem 5.** *Determining if a vertex of a tournament is a Slater winner remains Θ_2^p -complete even for tournaments that can be obtained from 7 voters.*

Proof. We perform the same reduction as in Theorem 3 except we start from the special case given in Lemma 4. What remains is to show that the instance we construct can result from aggregating 7 orderings. Recall that our tournament contains $6n$ modules representing the variables, called $A_i, B_i, C_i, D_i, E_i, F_i$, for $i \in \{1, \dots, n\}$ and m modules representing the clauses, called T_j , for $j \in \{1, \dots, m\}$. Since modules are internally transitive, we will assume that the 7 voters have preferences which agree with the directions of the arcs inside the modules and hence we focus on the arcs between modules. Recall that in the reduction of Theorem 3, arcs between modules T_j are set arbitrarily. To ease presentation, assume that when $j < j'$ we have the arcs $T_j \rightarrow T_{j'}$.

The first voter has preferences $A_1 \prec B_1 \prec C_1 \prec D_1 \prec E_1 \prec F_1 \prec A_2 \dots \prec F_n \prec T_1 \prec T_2 \prec \dots \prec T_m$. In other words, the first voter orders all the variable modules before all the clause modules, orders variable groups according to their index, and inside each variable group she has the ordering $A_i \prec B_i \prec C_i \prec D_i \prec E_i \prec F_i$.

We now add two voters with the intent of constructing all the arcs of the set

$$X_0 = \left(\bigcup_j T_j \times \bigcup_i (A_i \cup B_i \cup C_i) \right) \cup \bigcup_i (F_i \times D_i)$$

The first of these voters has ordering $(E_1 \prec E_2 \prec \dots \prec E_n) \prec (F_1 \prec D_1 \prec F_2 \prec D_2 \prec \dots \prec F_n \prec D_n) \prec (T_1 \prec T_2 \prec \dots \prec T_m) \prec (A_1 \prec B_1 \prec C_1 \prec A_2 \prec B_2 \prec C_2 \prec \dots \prec A_n \prec B_n \prec C_n)$. The second of these voters has ordering $(T_m \prec T_{m-1} \prec \dots \prec T_1) \prec (C_n \prec B_n \prec A_n \prec C_{n-1} \prec B_{n-1} \prec A_{n-1} \prec \dots \prec C_1 \prec B_1 \prec A_1) \prec (F_n \prec D_n \prec F_{n-1} \prec D_{n-1} \prec \dots \prec$

$F_1 \prec D_1) \prec (E_n \prec E_{n-1} \prec \dots \prec E_1)$. Note that these two voters agree that all modules of $\bigcup_j T_j$ come before all modules of $\bigcup_i (A_i \cup B_i \cup C_i)$ and that for each i we have $F_i \prec D_i$, but disagree on every other pair of modules, hence the two voters together induce exactly the set of arcs X_0 cited above.

If we now consider the three voters we have so far we observe that much of our construction is already induced:

1. For $i < i'$ we have arcs from $A_i \cup B_i \cup C_i \cup D_i \cup E_i \cup F_i$ to $A_{i'} \cup B_{i'} \cup C_{i'} \cup D_{i'} \cup E_{i'} \cup F_{i'}$ because of the preferences of the first voter, as the other two voters disagree on these arcs.
2. For each $i \in \{1, \dots, n\}$, inside the group $A_i \cup B_i \cup C_i \cup D_i \cup E_i \cup F_i$, we have arcs that agree with the ordering $A_i \prec B_i \prec C_i \prec D_i \prec E_i \prec F_i$, except that we have arcs from F_i to D_i . This is because the second and third voter agree that $F_i \prec D_i$, but disagree on every other pair (hence the preferences of the first voter prevail for the other pairs).
3. For each $j < j'$ we have arcs from T_j to $T_{j'}$, due to the preferences of the first voter, as the other two disagree.
4. For each $i \in \{1, \dots, n\}$ and $j \in \{1, \dots, m\}$ we have arcs from T_j to $A_i \cup B_i \cup C_i$, because the second and third voter agree that $T_j \prec (A_i \cup B_i \cup C_i)$ (though the first voter disagrees).
5. For each $i \in \{1, \dots, n\}$ and $j \in \{1, \dots, m\}$ we have arcs from $D_i \cup E_i \cup F_i$ to T_j , because the second and third voter disagree on these pairs, so the preferences of the first voter break the tie.

We therefore have that the tournament that follows from aggregating the preferences of the first three voters almost corresponds to the one we want to construct, except that for each $i \in \{1, \dots, n\}$ and $j \in \{1, \dots, m\}$ the arcs between T_j and $A_i \cup B_i \cup C_i \cup D_i \cup E_i \cup F_i$ correspond to the arcs we would want if x_i did not appear in the j -th clause (in other words, the three voters we have so far induce the general structure of the construction, but do not encode which variable appears in which clause). Furthermore, if we look at the relationship between any two modules so far, the margin of victory is always exactly one (that is, there do not exist two modules X, Y such that all three voters agree that $X \prec Y$).

Hence, what remains is to use the four remaining voters to “fix” this, so that if x_i appears (positive or negative) in the j -th clause, we have the arcs prescribed in the reduction of Theorem 3. We will achieve this by giving two pairs of voters. Each pair of voters will disagree on all pairs of modules except a specific set of arcs that we want to fix. Hence, adding the pair of voters to the electorate will repair the arcs in question (since the current margin of victory for all arcs is one), while leaving everything else unchanged.

Recall that the clause set is given to us partitioned into two sets R, L so that each variable appears in at most one clause of L and each literal in at most one clause of R . We will use the slightly weaker property that each literal appears at most once in each of L, R . Abusing notation we will write $j \in R$ if the j -th clause is in R (similarly for $j \in L$). We will also write $x_i \in c_j$ (respectively $\neg x_i \in c_j$) if x_i appears positive (respectively negative) in the j -th clause.

Consider now the following two sets of arcs:

$$X_1 = \left(\bigcup_{j \in R} \bigcup_{i: x_i \in c_j} (T_j \times F_i) \cup \bigcup_{i: \neg x_i \in c_j} (T_j \times D_i) \right) \cup \left(\bigcup_{j \in L} \bigcup_{i: x_i \in c_j} (C_i \times T_j) \cup \bigcup_{i: \neg x_i \in c_j} (B_i \times T_j) \right)$$

$$X_2 = \left(\bigcup_{j \in L} \cup_{i: x_i \in c_j} (T_j \times F_i) \cup \cup_{i: \neg x_i \in c_j} (T_j \times D_i) \right) \cup \left(\bigcup_{j \in R} \cup_{i: x_i \in c_j} (C_i \times T_j) \cup \cup_{i: \neg x_i \in c_j} (B_i \times T_j) \right)$$

Our plan is to give a pair of voters whose preferences induce the arcs of X_1 and another pair whose preferences induce the arcs of X_2 . Here when we say that two voters induce a set of arcs X we mean that for each $(a, b) \in X$ both voters have $a \prec b$ and for each $(a, b) \notin X$ one voter has $a \prec b$ and the other has $b \prec a$. Before we proceed we observe that if X_1, X_2 are inducible by a pair of voters each, then adding these four voters to the three voters we have described so far produces the tournament of Theorem 3. Indeed, suppose that x_i appears positive in clause c_j and $j \in R$. Then, if we consider the arcs in the tournament induced by the first three voters, we need to inverse the arcs between T_j and F_i (which currently point $F_i \rightarrow T_j$), and the arcs between T_j and C_i (which currently point $T_j \rightarrow C_i$). But the arcs between T_j and F_i are inversed thanks to X_1 , while the arcs between T_j and C_i are inversed thanks to X_2 , where we use the fact that X_1, X_2 represent the consensus of two voters, while the margin of victory for any arc induced by the first three voters is one. Similar arguments apply if x_i appears negative in c_j , or $j \in L$. Hence, if a pair of voters induces X_1 and another induces X_2 , taking the union of these four voters with the three voters we have described produces the tournament of Theorem 3 and completes the proof.

We now recall that it was shown in [3] that X_1, X_2 are inducible by two voters each, since these sets of arcs are unions of stars (if we contract each module to a vertex). Let us explain in more detail how to represent X_1 as the union of the preferences of two voters (the arguments for X_2 are essentially identical). We will make use of the fact that each literal appears at most once in L and at most once in R .

We will say that a module from a variable group is “active” if it is incident on an arc of X_1 . In particular, modules A_i, E_i , for $i \in \{1, \dots, n\}$ are not active, and neither are modules F_i such that x_i does not appear positive in R (and similarly for B_i, C_i, D_i). We will concentrate on the ordering of active modules because if we find two voter profiles that order these modules in a way that induces X_1 , we can add an arbitrary ordering of the inactive modules in the beginning of the preferences of the first voter, and the opposite of that ordering at the end of the preferences of the second voter. This will have as effect that the two voters disagree on any pair that involves an element of an inactive module, as desired.

We now observe that for each active module M from $\bigcup_i B_i \cup C_i \cup D_i \cup F_i$, there exists exactly one T_j such that M has arcs to T_j in X_1 . This is because every literal appears in at most one clause of R and at most one clause of L . Now, we construct two voter profiles as follows: one voter orders the T_j modules in increasing order of index and the other in decreasing order. For each active module D_i or F_i , we insert the module immediately after the T_j from which the module receives arcs in X_1 in both orderings; for active modules B_i or C_i we insert them immediately before the T_j towards which the module has arcs in both orderings. Note that this does not fully specify the ordering, as if two variables $x_i, x_{i'}$ appear in c_j and $j \in R$, then we need to place F_i and $F_{i'}$ immediately after T_j . We resolve such conflicts by using an arbitrary ordering of the active modules for the first voter and the opposite of that ordering for the second voter, that is, all modules which are supposed to appear immediately after T_j are sorted in one way for the first voter and in the opposite way for the second voter. We now observe that with this ordering for every active module the two voters agree about the arcs connecting the module to its neighboring T_j , while we obtain no other arcs between the module and any other $T_{j'}$ or any other active module. We therefore have two voters whose preferences induce X_1 . ◀

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A Omitted Proofs

A.1 Proof of Lemma 1

Lemma 1. Suppose $k > 1$ (otherwise the claim is trivial) and consider an ordering \prec that is winning for v . We will say that a set of vertices $S \subseteq V$ is a *block* of \prec if (i) $S \subseteq M_i$ for some $i \in \{1, \dots, k\}$; (ii) S is contiguous; (iii) S is maximal, that is, adding any vertex to S violates one of the two preceding properties.

If the number of blocks is equal to k we are done, as each block is equal to a module so we have an ordering where each module is contiguous. If we have at least $k + 1$ blocks, we will explain how to edit the ordering so that it remains winning for v , it implies a fas of the same size, and the number of blocks decreases. Repeating this process until we have k blocks completes the proof.

Consider two vertices x, y , with $x \prec y$, which belong to the same module, say $x, y \in M_1$, but in distinct blocks. Among all such pairs, select x, y so that their distance in the ordering, that is, the size of the set $Z = \{z \mid x \prec z \prec y\}$ is minimized. Let X, Y be the blocks that contain x, y respectively. Note that by the selection of x, y we have that x is the last vertex of X , y is the first vertex of Y , $X \cup Y \subseteq M_1$, and $M_1 \cap Z = \emptyset$.

Let $d_{\text{out}}^Z(x)$ (respectively $d_{\text{in}}^Z(x)$) be the out-degree (respectively in-degree) of x towards the set Z . Because M_1 is a module, all vertices of M_1 have the same in-degree and out-degree towards Z , and in particular, $d_{\text{out}}^Z(x) = d_{\text{out}}^Z(y)$ and $d_{\text{in}}^Z(x) = d_{\text{in}}^Z(y)$. Now, if $d_{\text{in}}^Z(x) > d_{\text{out}}^Z(x)$, we can obtain an ordering that implies a smaller fas by placing x immediately after the last vertex of Z . This would contradict the optimality of \prec , so it must be impossible. Similarly, if $d_{\text{in}}^Z(x) < d_{\text{out}}^Z(x)$, we have $d_{\text{in}}^Z(y) < d_{\text{out}}^Z(y)$, and we can obtain a strictly better ordering by placing y immediately before the first vertex of Z , contradiction. We conclude that $d_{\text{in}}^Z(x) = d_{\text{in}}^Z(y)$. Therefore, moving all the vertices of X so that they appear immediately after the last vertex of Z produces an ordering which is equally good as the current one, is still winning for v , and has a smaller number of blocks. \blacktriangleleft

A.2 Proof of Lemma 4

Lemma 4. Given a formula ϕ as in Lemma 2 we construct a new formula ϕ' as follows. Let x_1, x_2, \dots, x_n be the variables of ϕ and m be the number of its clauses. For each x_i , $i \in \{1, \dots, n\}$ we construct m variables, call them $y_i^1, y_i^2, \dots, y_i^m$. For each $i \in \{1, \dots, n\}$, for $j \in \{1, \dots, m-1\}$ we construct the clause $(\neg y_i^j \vee y_i^{j+1})$, as well as the clause $(\neg y_i^m \vee y_i^1)$. Let R be the set of clauses constructed so far and note that each literal appears at most once and each variable at most twice in these clauses. Intuitively, the clauses of R ensure that for each i , all variables in the set $\{y_i^1, y_i^2, \dots, y_i^m\}$ must receive the same value in a satisfying assignment.

Now, we consider the clauses of ϕ one by one. If the j -th clause contains the variable x_i , we replace it by the variable y_i^j . Doing this for all clauses of ϕ we obtain a set of clauses, call it L , where each variable appears at most once (assuming without loss of generality that clauses of ϕ have no repeated literals).

If x_n was the designated variable of ϕ we set y_n^1 as the designated variable of ϕ' . It is now not hard to make a correspondence between satisfying assignments of ϕ and ϕ' (x_i is set to True if all y_i^j are set to True) in a way that preserves weights (the weight of an assignment to ϕ' is m times the weight of the corresponding assignment for ϕ). Hence, determining if a maximum weight satisfying assignment to ϕ' sets y_n^1 to True is Θ_2^p -complete. Observe also that ϕ' is satisfied by the all-False assignment. \blacktriangleleft