# **Complexity of Additive Committee Selection with Outliers**

Extended Abstract

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## ABSTRACT

We study the  $\varphi_f$ -OUTLIERS problem, where we are given an election and are asked whether there are at most  $\bar{n}$  votes whose removal leads to the existence of a *k*-committee of a desired quality under the voting rule  $\varphi_f$ . We investigate the (parameterized) complexity of  $\varphi_f$ -OUTLIERS for additive *k*-committee selection rules, in both the general case and several special cases with respect to the incidence graphs of the given elections.

# **KEYWORDS**

multiwinner voting; outliers; parameterized complexity; approval

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# **1 PRELIMINARIES**

Approval-based *k*-committee selection rules, which aim to select *k* winners based on the dichotomous preferences of voters over candidates, have received a considerable amount of attention recently [1, 3, 7, 11–13] due to their significant applications in many areas.

Precisely, an *election* is a tuple (C, V) where C is a set of candidates and V is a multiset of votes. Each vote is a nonempty subset of *C*. We say a vote  $v \in V$  *approves* a candidate  $c \in C$  if  $c \in v$ . For a set S,  $2^S$  denotes the power set of S. A k-committee is a subset of *C* of cardinality *k*. A scoring *k*-committee selection rule maps each election (C, V) to a k-committee. Particularly, let  $f: 2^C \times 2^C \to \mathbb{Q}$ be a scoring function, where for a vote  $v \subseteq C$  and a committee  $w \subseteq C$ , f(v, w) is the *score* of w obtained from v. By a slight abuse of notation, for an election (C, V) and a committee w, let  $f(V, w) = \sum_{v \in V} f(v, w)$  be the score of w in (C, V). A minimizing *k*-committee selection rule  $\varphi_f$  selects a *k*-committee with the minimum score, with respect to f, as the winning committee. We say that  $\varphi_f$  is *additive* if for every vote v and every nonempty committee w it holds that  $f(v, w) = \sum_{c \in w} f(v, \{c\})$ . In this paper, we study only minimizing additive rules that subject to the following constraints. First, for all  $v, w, v', w' \subseteq C$  such that |v| = |v'|, |w| = |w'|,and  $|v \cap w| = |v' \cap w'|$  it holds that f(v, w) = f(v', w'). For simplicity, we denote by **f** a function from  $\{0, 1, ..., |C|\}^3$  to  $\mathbb{Q}$  such

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Table 1: A summary of addi	tive rules. Here, $v \subseteq C$ is a vote
and $w \subseteq C$ is a committee. I	n NSAV, if $v$ approves all candi-
dates, i.e., $v = C$ , we remove	$\frac{ w \setminus v }{ C  -  v }$ (i.e., we take $\frac{ w \setminus v }{ C  -  v } = 0$ ).

voting rules	scoring functions $f(v, w)$		
	maximizing	minimizing	
Approval voting (AV)	$ v \cap w $	$\begin{aligned}  v \setminus w  +  w \setminus v , \\ \text{or, }  w \setminus v , \\ \text{or, }  v \setminus w  \end{aligned}$	
Net-approval voting (NAV)	$ v \cap w  -  w \setminus v $	$ w \setminus v  -  v \cap w $	
Satisfaction approval voting (SAV)	$\frac{ v \cap w }{ v }$	$\frac{\frac{ v \setminus w  +  w \setminus v }{ v }, \text{ or }}{\frac{ v \setminus w }{ v }, \text{ or } \frac{ w \setminus v }{ v }}$	
Net-SAV (NSAV)	$\frac{ v \cap w }{ v } - \frac{ w \setminus v }{ C  -  v }$	$\frac{ w \setminus v }{ C  -  v } - \frac{ v \cap w }{ v }$	

that for every  $v, w \subseteq C$  it holds that  $f(|v|, |v \cap w|, |w|) = f(v, w)$ . We make the assumption that scoring functions f are given as oracles and, moreover, given  $v, w \subseteq C$ , f(v, w) and  $f(|v|, |v \cap w|, |w|)$  can be returned in polynomial time in max $\{|v|, |w|\}$ . Second, for every vote v, it holds that f(|v|, 1, 1) < f(|v|, 0, 1). Therefore, for feasible integers x, y, y', z such that  $y > y' \ge 0$  it holds that f(x, y, z) < f(x, y', z). All minimizing rules in Table 1 are additive rules fulfilling the above constraints [8].

We study the problem of committee determination in the presence of outliers which models the scenario where a limited number of voters, called outliers, are needed to be removed in order to find a desired winning *k*-committee. The formal definition is as follows.

$\varphi_f$ -Outlief	85
Given:	An election ( <i>C</i> , <i>V</i> ), two nonnegative integers $k \le  C $ and $\bar{n} <  V $ , and a rational number <i>t</i> .
Question:	Are there $U \subseteq V$ and $w \subseteq C$ such that $ w  = k$ , $ U  \leq \overline{n}$ and $f(V', w) \leq t$ , where $V' = V \setminus U$ ?

The  $\varphi_f$ -COMMITTEE DETERMINATION problem ( $\varphi_f$ -CD) is a special case of  $\varphi_f$ -OUTLIERS where  $\bar{n} = 0$ . Throughout this paper, let m = |C|, n = |V|,  $n^* = n - \bar{n}$ , and  $\bar{k} = m - k$ .

The  $\varphi_f$ -OUTLIERS problem was first studied by Dey et al. [4] for minimizing versions of AV and NAV. We study the class of additive rules, which include many important rules not studied in [4]. Moreover, we mainly develop general theorems which hold for almost all

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additive rules. In addition, we explore the parameterized complexity of this problem with respect to some structural parameters of the incidence graphs of elections.

### 2 RESULTS IN THE GENERAL CASE

For  $\varphi_f$ -CD, polynomial-time algorithms have been developed for some concrete additive rules [2, 4]. We give a general result.

THEOREM 2.1. For an additive rule  $\varphi_f$ , an optimal k-committee with respect to  $\varphi_f$  can be calculated in polynomial time.

Dey et al. [4] studied  $\varphi_f$ -OUTLIERS for minimizing variants of AV and NAV, and showed FPT results with respect to *m* and *n*. We extend their result to all additive rules.

THEOREM 2.2. For an additive rule  $\varphi_f$ ,  $\varphi_f$ -OUTLIERS is FPT with respect to both m and n.

As  $\bar{n} + n^* = n$  and  $\bar{k} + k = m$ , it remains to study the combined parameters  $n^* + k$ ,  $n^* + \bar{k}$ ,  $\bar{n} + k$ , and  $\bar{n} + \bar{k}$ . Concerning the parameters  $n^* + k$  and  $\bar{n} + \bar{k}$ , Dey et al. [4] showed that  $\varphi_f$ -OUTLIERS for minimizing variants of AV and NAV is W[1]-hard. In particular, for  $n^* + k$  the result holds even when every voter approves only two candidates. However, for the parameter  $\bar{n} + \bar{k}$ , their reduction does not apply to this special case.

THEOREM 2.3. Let f be an additive function such that for every  $k \ge 3$  it holds that f(2, 1, k) > 0. Then,  $\varphi_f$ -OUTLIERS is W[1]-hard with respect to  $n^* + k$  and  $\bar{n} + \bar{k}$ , even when every voter approves at most two candidates.

The above theorem applies to all rules in Table 1 except NSAV.

THEOREM 2.4. NSAV-OUTLIERS is W[1]-hard with respect to both  $\bar{n} + \bar{k}$  and  $n^* + k$ .

Regarding  $n^* + \bar{k}$  and  $\bar{n} + k$ , in the W[1]-hardness proof for the minimizing variants of AV in [4], all voters approve the same number of candidates. In this case, the minimizing variants of SAV and AV are equivalent. However, this is not the case for NSAV.

THEOREM 2.5. NSAV-OUTLIERS is W[1]-hard with respect to the parameters  $n^* + \bar{k}$  and  $\bar{n} + k$ .

Let  $\triangle = \max_{v \in V} \{|v|\}$ ; hence, every voter approves at most  $\triangle$  candidates. As shown in Theorem 2.3,  $\varphi_f$ -OUTLIERS cannot be FPT even with respect to the combined parameters  $n^* + k + \triangle$  and  $\bar{n} + \bar{k} + \triangle$  unless FPT=W[1]. In the following, we show an FPT-algorithm for  $\varphi_f$ -OUTLIERS with respect to the parameter  $\bar{n} + k + \triangle$ .

THEOREM 2.6.  $\varphi_f$ -OUTLIERS for additive rules  $\varphi_f$  is FPT with respect to the combined parameter  $\bar{n} + k + \Delta$ .

#### **3 RESTRICTED INCIDENCE GRAPHS**

For an election E = (C, V), its *incidence graph*  $G_E = (C \cup V, A)$  is a bipartite graph with the vertex bipartition (C, V) and edge set  $A = \{(c, v) \mid c \in C, v \in V, c \in v\}$ . We study some structural parameters of  $G_E$ . First, we have the following result.

THEOREM 3.1. For an additive rule  $\varphi_f$ ,  $\varphi_f$ -OUTLIERS is FPT with respect to the size of the maximum matching of the incidence graph of the given election.

Now we identify several special classes of incidence graphs restricted to which  $\varphi_f$ -OUTLIERS is polynomial-time solvable. For two graphs H and H', we say that H is H'-free if H contains no induced subgraph that is isomorphic to H'. For two graph classes  $\mathcal{H}$  and  $\mathcal{H}', \mathcal{H}$  is  $\mathcal{H}'$ -free if none of  $\mathcal{H}$  has an induced subgraph isomorphic to some graph in  $\mathcal{H}'$ . A *star* with r leaves is denoted by  $K_{1,r}$ , and a *path* of length r (the number of vertices in it) is denoted by  $P_r$ .

THEOREM 3.2.  $\varphi_f$ -OUTLIERS is polynomial-time solvable if the incidence graph of the given election is  $K_{1,3}$ -free.

One may wonder whether we can extend the above result to  $K_{1,r}$ -free incidence graphs for some other constants  $r \ge 4$ . Unfortunately, we show that this is not the case.

THEOREM 3.3. For an additive function f such that f(2, 1, k) > 0for every  $k \ge 3$ ,  $\varphi_f$ -OUTLIERS is NP-hard even if the incidence graph of the given election is  $K_{1,4}$ -free.

Based on the following lemma, we show that  $\varphi_f$ -OUTLIERS for many additive rules is polynomial-time solvable when the incidence graph is  $P_5$ -free. A *non-trivial connected component* is a connected component with at least two vertices.

LEMMA 3.4. Let  $G = (C \cup V, A)$  be a  $P_5$ -free bipartite graph, and H a non-trivial connected component of G. Then, there is an order  $(c_1, \ldots, c_x)$  of the candidates in H such that for each  $v \in V$ there is a positive integer  $\tau(v) \leq x$  such that v is adjacent to  $c_i$  if and only if  $1 \leq i \leq \tau(v)$ . Moreover, such an order can be found in polynomial time.

In fact, the above lemma shows that any election whose incidence graph is  $P_5$ -free is a special case of the so-called *Candidate Interval* (CI) election studied in the literature [5, 6, 9, 10].

THEOREM 3.5.  $\varphi_f$ -OUTLIERS is polynomial-time solvable if the incidence graph is  $P_5$ -free.

#### 4 A GENERAL FPT RESULT

For a graph class  $\mathcal{H}$ , let  $F_{\mathcal{H}}$  be the class of all  $\mathcal{H}$ -free graphs. For an integer r > 0, let  $F_{\mathcal{H}}^{r+}$  be the class of graphs which include at most r induced subgraphs isomorphic to graphs in  $\mathcal{H}$  in total.  $\varphi_f$ -OUTLIERS restricted to a graph class  $\mathcal{G}$  means that the incidence graphs of the given elections are in  $\mathcal{G}$ .

THEOREM 4.1. Let  $\mathcal{H}$  be a set consisting of a constant number of graphs each of which contains at least one edge and at most d vertices, where  $d \ge 2$  is a constant. If  $\varphi_f$ -OUTLIERS restricted to  $F_{\mathcal{H}}$  is polynomial-time solvable for all additive rules  $\varphi_f$ , then,  $\varphi_f$ -OUTLIERS restricted to  $F_{\mathcal{H}}^+$  is FPT for all additive rules  $\varphi_f$ , with respect to r.

Due to Theorems 3.2, 3.5, and 4.1, we have the following result.

COROLLARY 4.2. For an additive rule  $\varphi_f$ ,  $\varphi_f$ -OUTLIERS is FPT with respect to the number of induced claw/P<sub>5</sub> in the incidence graph of the given election.

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