

Core-Stable Committees under Restricted Domains

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Abstract

We study the setting of committee elections, where a group of individuals needs to collectively select a given-size subset of available objects. This model is relevant for a number of real-life scenarios including political elections, participatory budgeting, and facility-location. We focus on the core—the classic notion of proportionality, stability and fairness. We show that for a number of restricted domains including voter-interval, candidate-interval, single-peaked, and single-crossing preferences the core is non-empty and can be found in polynomial time. We show that the core might be empty for strict top-monotonic preferences, yet we introduce a relaxation of this class, which guarantees non-emptiness of the core. Our algorithms work both in the randomized and discrete models. We also show that the classic known proportional rules do not return committees from the core even for the most restrictive domains among those we consider (in particular for 1D-Euclidean preferences). We additionally prove a number of structural results that give better insights into the nature of some of the restricted domains, and which in particular give a better intuitive understanding of the class of top-monotonic preferences.

1 Introduction

We consider the model of committee elections, where the goal is to select a fixed-size subset of objects based on the preferences of a group of individuals. The objects and the individuals are typically referred to as the *candidates* and the *voters*, respectively, a convention that we follow in our paper. Yet, the candidates do not need to represent humans. For example, the model of committee elections describes the problems of (1) locating public facilities—there the candidates correspond to possible physical locations in which the facilities can be built [21, 30], (2) presenting results by a search engine in response to a user query—there, the candidates are web-pages, and voters are potential users searching for a given query [31], (3) selecting validators in the blockchain, where the candidates are the users of the protocol [10, 9]. For more examples that fall into the category of committee elections see the recent book chapter [20] and survey [23].

In numerous applications that fit the model of committee elections it is critical to select a subset of candidates, hereinafter called a *committee*, in a fair and proportional manner. Proportionality is one of the fundamental requirements of methods for selecting representative bodies, such as parliaments, faculty boards, etc. Yet, even in the context of facility location the properties that corresponds to proportionality are desirable: more objects should be built in densely populated areas, ideally ensuring that the distribution of the locations of the built facilities resembles the distribution of the locations of the potential users. In case of searching, the returned results should contain items that are interesting to different types of users, or—in other words—the preferences of each minority of users should be represented in the returned set of results. Finally, the validators in the blockchain should proportionally represent the protocol users in order to make validation robust against coordinated attacks of malicious users. In all these examples it is important to select a proportional committee, yet it is not entirely clear what it means that the committee proportionally reflects the opinions of the voters, let alone how to find such a committee.

The problem of formalizing the intuitive idea of proportionality has been often addressed in the literature and a plethora of axioms have been proposed (see [23][Section 5] and [20][Section 2.3.3]). Among them, the notion of the core is particularly interesting. This concept, borrowed from cooperative game theory [26, 11] can be intuitively described as follows: assume our goal is to select a committee of k candidates based on the ballots submitted by n voters. Then, a group of n/k voters

should intuitively have the right to select one committee member, and—analogously—a group of $\ell \cdot n/k$ voters should be able to decide about ℓ members of the elected committee. This intuition is formalized as follows: we say that a committee W is in the core if no group S of $\ell \cdot n/k$ voters can propose a set of ℓ candidates T such that each voter from S prefers T over W .

The notion of the core is intuitively appealing, universal, and strong. It applies to different types of voters’ ballots, in particular to the *ordinal* and *approval* ones. In the ordinal model the voters rank the candidates from the most to the least preferred one, while in the approval model, each voter only marks the candidates that she find acceptable—we say that the voter approves such candidates. Being in the core implies numerous other fairness-related properties, among them properties which are rather strong on their own. For example, in the approval model the core implies the properties of extended justified representation (EJR) [2], proportional justified representation (PJR) [29], and justified representation (JR) [2]. For ordinal ballots, being in the core implies the properties of unanimity, consensus committee, and solid coalitions [15], as well as Dummett’s proportionality [13] and proportionality for solid coalitions (PSC) [1]. In Appendix A.1 we also explain that for ordinal ballots being in the core is equivalent to satisfying full local stability [3].

While core-stability—the property of a voting rule that requires that each elected committee should belong to the core—is highly desired, it is also very demanding. For ordinal ballots there exists no core-stable rule, and for approval ballots it is one of the major open problems in computational social choice to determine whether the property is satisfiable. Given the property is so demanding, so far the literature focused on its relaxed versions—either the weaker properties which we mentioned before, or the approximate [22, 27] and the randomized [12] variants of the core have been extensively studied.

In our work we explore a different, yet related approach. Our point is that before we look at how a voting rule works in the general case, at the very minimum we shall ensure that it behaves well on well-structured preferences. Thus, the main question that we state in this paper is whether core-stability can be satisfied for certain natural restricted domains of voters’ preferences, and what is the computational complexity of finding committees that belong to the core given elections where the voters’ preferences come from restricted domains. The idea to restrict the scope only to instances in which the preferences are somehow well-structured is not new [16], yet to the best of our knowledge it has never been considered in the context of the core.

Our Contribution

Our work contributes to two areas of computational social choice. First, we prove a number of structural theorems that describe existing domain restrictions. In particular, our results give a more intuitive explanation of the class of top-monotonic preferences. The original definition of this class is somewhat cumbersome. We show two independent conditions that provide alternative characterisations of top-monotonic preferences provided the voters’ preference rankings have no ties. We also introduce two new domain restrictions which are natural, and which provide sufficient conditions for the existence of core-stable rules. One of our new classes generalizes voter-interval and candidate-interval domains [14], and the other class is a weakening of the domain of top-monotonic preferences; yet our class still includes single-peaked [6] and single-crossing preferences [25, 28].

Second, we prove the existence of core-stable rules under the assumption that the voters’ preferences come from certain restricted domains, in particular from domains of voter-interval, candidate-interval, single-peaked, and single-crossing preferences. Interestingly, we show a single algorithm that is core-stable for all four aforementioned domains. At the same time, we show that if we restrict our attention to top-monotonic elections no core-stable rule exists.

The idea of our algorithm is the following. We first find a fractional (randomized) committee that is in the core. We pick those candidates that have been selected with probability equal to one. We choose the remaining candidates using a variant of the median rule applied to the truncated instance of the original election. Thus, our results hold both in the discrete and in the probabilistic case.

2 Preliminaries

2.1 Elections, Preferences, and Committees

For each $t \in \mathbb{N}$, we set $[t] = \{1, 2, \dots, t\}$.

An *election* is a tuple $E = (N, C, k)$, where $N = [n]$ is a set of n voters, C is a set of m candidates, and k is the desired *committee size*. Each voter $i \in N$ submits her weak ranking \succsim_i over the candidates—for each $i \in N$ and $a, b \in C$, we say that voter i weakly prefers candidate a over candidate b if $a \succsim_i b$. We set $a \sim_i b$ if $a \succsim_i b$ and $b \succsim_i a$, and we write $a \succ_i b$ if $a \succsim_i b$ and $a \not\sim_i b$. For a voter $i \in N$ and $j \in [m]$, by $\text{pos}_i(j)$ we denote the equivalence class of candidates ranked on the j -th position by voter i . Formally, a candidate c belongs to $\text{pos}_i(j)$ if there are $(j-1)$ candidates a_1, \dots, a_{j-1} such that $a_1 \succ_i a_2 \succ_i \dots \succ_i a_{j-1} \succ_i c$ and if there exist no j candidates a_1, \dots, a_j for which $a_1 \succ_i a_2 \succ_i \dots \succ_i a_j \succ_i c$. By d_i we denote the number of the nonempty positions in the i -th voter's preference list. For each $j \in [d_i]$, by $\text{pos}_i([j])$ we denote $\bigcup_{q \leq j} \text{pos}_i(q)$. For each $i \in N$, by top_i and bot_i we denote the sets of candidates ranked respectively at the highest and the lowest position (note that $\text{top}_i = \text{pos}_i(1)$ and $\text{bot}_i = \text{pos}_i(d_i)$).

We distinguish two specific types voters' preferences.

Approval preferences. The preferences are *approval*, if for each candidate $c \in C$ and each voter $i \in N$ either $c \in \text{top}_i$ or $c \in \text{bot}_i$. We say that i *approves* c if $c \in \text{top}_i$.

Strict preferences. The preferences are *strict*, if for all $a, b \in C$ ($a \neq b$) and each $i \in N$ it holds that $a \sim_i b$.

We call k -element subsets of C *size- k committees*, or in short committees, if the size k is clear from the context. We extend this notion to the continuous model as follows: a *fractional committee* is a function $p: C \rightarrow [0, 1]$ that assigns to each candidate from $c \in C$ a value $p(c)$ such that $0 \leq p(c) \leq 1$; intuitively $p(c)$ can be thought of as the probability that candidate c is a member of the selected committee. We extend this notation to sets, defining $p(T) = \sum_{c \in T} p(c)$ for each $T \subseteq C$. The value of $p(C)$ is the *size* of the fractional committee. If for a candidate c it holds that $p(c) = 1$, then we say that c is *elected*, otherwise she is *unelected*. If for an unelected candidate c it holds that $p(c) > 0$, then c is *partially elected*. If there are no partially elected candidates in p , then we say that p is a *discrete committee* (or simply a committee) and associate it with the set $\{c \in C: p(c) = 1\}$.

A *voting rule* is an algorithm that takes as input an election, and returns a nonempty set of committees, hereinafter called winning committees.¹ A fractional voting rule is an algorithm that given an election returns a fractional committee.

The notion of a fractional committee is similar to several probabilistic concepts considered in the literature. For instance, in probabilistic social choice (see the book chapter [7]) we also assign fractional values to candidates. The main difference is that in probabilistic social choice, the whole value that we want to divide among the candidates can be assigned to fewer than k candidates; in particular it is feasible to set $p(c) = k$ for one candidate and $p(c') = 0$ for all $c', c' \neq c$. Thus, intuitively, in probabilistic social choice each candidate is divisible and appears in an unlimited quantity. Viewed from this perspective, probabilistic social choice extends the discrete model of approval-based apportionment [8]. Several works have considered axioms of proportionality for probabilistic social choice [4, 18], yet unfortunately their results do not apply to fractional committees.

Another concept related to fractional committees is where we assign probabilities to committees instead of individual candidates. The notions of proportionality in this setting have been considered, e.g., in [12]. It is worth noting that fractional committees can induce probability distributions over committees, e.g., by applying sampling techniques, such as dependent rounding [32], that ensure we always select k candidates. Yet, there is no one-to-one equivalence between the two settings, thus the results of [12] do not apply to fractional committees.

¹Typically a voting rule would return a single winning committee, but ties are possible.

2.2 The Core as a Concept of Proportionality

There are numerous axioms that aim at formalizing the intuitive idea of proportionality. In this paper we focus on one of the strongest such properties, the *core* [2]. The idea behind the definition of the core is the following: a group of voters S should be allowed to decide about a subset of candidates that is proportional to the size of S ; for example a group consisting of 70% of voters should have the right to decide about 70% of the elected candidates. The core prohibits situations where a group S can propose a proportionally smaller set of candidates T such that each voter from S would prefer T to the committee at hand.

Definition 1 (The core). *Given an election instance $E = (N, C, k)$, we say that a committee W is in the core, if for each $S \subseteq N$ and each subset of candidates T with $|T| \leq k \cdot |S|/n$ there is a voter $v \in S$ weakly preferring W to T .*

In the above definition we still need to specify how the voters compare committees, i.e., how their preferences over individual candidates can be extended to the preferences over committees. For each voter $i \in N$ by \triangleright_i we denote the partial order over 2^C being the result of extending the preference relation of i . Throughout the whole paper we use the *lexicographic* extension, both in case of discrete and fractional committees, defined formally as follows for discrete ones:

$$W \triangleright_i T \iff \exists \sigma \in [d_i]. |\text{pos}_i(\sigma) \cap W| > |\text{pos}_i(\sigma) \cap T| \\ \text{and } \forall \varrho < \sigma. |\text{pos}_i(\varrho) \cap W| = |\text{pos}_i(\varrho) \cap T|.$$

and for fractional ones:

$$p \triangleright_i p' \iff \exists \sigma \in [d_i]. p(\text{pos}_i(\sigma)) > p'(\text{pos}_i(\sigma)) \\ \text{and } \forall \varrho < \sigma. p(\text{pos}_i(\varrho)) = p'(\text{pos}_i(\varrho)).$$

Note that for approval preferences it boils down to counting approved candidates in T and T' (since in Definition 1 $|W| \geq |T|$, a voter weakly prefers W over T whenever she approves at least as many candidates in W as in T). An alternative preference extension is considered in Appendix A.1.

Definition 1 naturally extends to fractional committees.

Definition 2 (The core (for fractional committees)). *Given an election instance $E = (N, C, k)$, we say that a fractional committee p is in the core, if for each $S \subseteq N$ and each fractional committee p' with $p'(C) \leq k \cdot |S|/n$, there exists a voter $i \in S$ such that i weakly prefers p over p' .*

We say that a voting rule is *core-stable* if it always returns committees in the core.

3 Restricted Domains

A voting rule specifies an outcome of an election independently of what the voters' preferences look like. Similarly, core-stability puts certain structural requirements on the selected committees that should be satisfied in every possible election. However, the space of all elections is rich and it might be too demanding to expect a voting rule to satisfy a strong property in each possible case. (This is the case for the core: there are elections with strict rankings where no non-fractional committee belongs to the core [19, 12]; the question whether the core is always non-empty assuming approval preferences is still open.) Instead, what is often desired is that a voting rule should satisfy strong notions of proportionality when the voters' preferences are in some sense logically consistent. This motivates focusing primarily on election instances where the voters' preferences are well-structured, or—in other words—come from certain restricted domains.

To the best of our knowledge, none of the known voting rules is core-stable, even for more restricted domains than considered in our work (see Appendix C for a few examples).

In this section we describe several known and introduce one new preference domain. We also provide alternative conditions characterising some of the considered domains. These results will help us in our further analysis of voting methods, but are also interesting on their own.

Due to space limit, we defer all the proofs in this section to Appendix B.

3.1 Strict Preferences

For strict ordinal preferences we start by recalling the definitions of the following two classes.

Definition 3 (Single-crossing preferences). *Given an election instance $E = (N, C, k)$, we say that E has single-crossing preferences if there exists a linear order \sqsupset over voters such that for each voters $x \sqsupset y \sqsupset z$ and candidates $a, b \in C$ such that $a \succ_y b$ we have that $b \succ_x a \implies a \succ_z b$.*

Intuitively, we say that preferences are single-crossing if the voters can be ordered in such a way that for each pair of candidates, $a, b \in C$, the relative order between a and b changes at most once while we move along the voters.

Definition 4 (Single-peaked preferences). *Given an election instance $E = (N, C, k)$, we say that E has single-peaked preferences if there exists a linear order \sqsupset over candidates such that for each voter $i \in N$ and candidates $a \sqsupset b \sqsupset c$ we have that $\text{top}_i = a \implies b \succ_i c$ and $\text{top}_i = c \implies b \succ_i a$.*

We will now recall the definition of the *top monotonic* domain [5]. This domain is defined assuming the voters submit their preferences as weak orders. For strict preferences it generalizes both the single-peaked and single-crossing domain. We call all candidates that are ranked in the top position by at least one voter top-candidates.

Definition 5 (Top monotonicity (TM)). *Given an election $E = (N, C, k)$, we say that E has top monotonic preferences if there exists a linear order \sqsupset over the candidates such that the two following conditions hold:*

1. *for all candidates a, b, c and voters i, j such that $a \in \text{top}_i$ and $b \in \text{top}_j$ it holds that:*

$$\begin{array}{l}
 a \sqsupset b \sqsupset c \text{ or} \\
 c \sqsupset b \sqsupset a
 \end{array}
 \implies
 \begin{cases}
 b \succ_i c & \text{if } c \in \text{top}_i \cup \text{top}_j \\
 b \succ_i c & \text{otherwise}
 \end{cases}$$

2. *the same implication holds also for all top-candidates a, b, c and voters i, j such that $a \succ_i b, c$ and $b \succ_j a, c$.*

The definition of top-monotonic preferences is complex and somewhat counterintuitive. We will first show that for strict orders this definition can be equivalently characterized by two much simpler and more intuitive conditions.

Definition 6 (Single-top-peaked preferences). *Given an election $E = (N, C, k)$, we say that E has single-top-peaked (STP) preferences if there exists a linear order \sqsupset over the candidates such that for all candidates $a \sqsupset b \sqsupset c$ such that b is a top-candidate, and each voter i it holds that $\text{top}_i = a \implies b \succ_i c$ and $\text{top}_i = c \implies b \succ_i a$.*

Proposition 1. *For strict rankings, single-top-peakedness is equivalent to top-monotonicity.*

It is clear that the definition of STP is closely connected to the definition of single-peaked preferences (only the condition is partially weakened to the candidates that are ranked top by some voter). One could also consider the analogous weakening for single-crossing preferences.

Definition 7 (Single-top-crossing preferences). *Given an election $E = (N, C, k)$, we say that E has single-top-crossing (STC) preferences if there exists a linear order \sqsupset over voters such that for all voters $x \sqsupset y \sqsupset z$ and a candidate $a \in C$, we have that $a \succ_x \text{top}_y \implies \text{top}_y \succ_z a$.*

Although the definitions of STC and STP look different, they are in fact equivalent.

Proposition 2. *For strict rankings, single-top-peakedness is equivalent to single-top-crossingness.*

Recall that single-crossingness implies single-peakedness for narcissist domains, i.e., under the assumption that each candidate is ranked top at least once [17]. Since for narcissist domains a single-peaked profile is also single-top-peaked, we get a corollary: single-peakedness is equivalent to single-top-crossingness assuming narcissist preferences.

The class of top monotonic preferences (TM) puts a focus on the top positions in the voters' preference rankings. For example, an election in which the voters unanimously rank a single candidate as their most preferred choice is top-monotonic, independently of how the other candidates are ranked. This suggests that TM offers a combinatorial structure that might be useful in the analysis of single-winner elections, but which might not help to reason about committees. Indeed, below we define a new class which is a natural strengthening of TM. In Section 4 we show that the core is always nonempty for elections belonging to our newly defined class, and we show that this is not the case for the original class of TM.

Definition 8 (Recursive single-top-crossing (r-STC) preferences). *Given an election $E = (N, C, k)$, we say that E has recursive single-top-crossing preferences if every subinstance of E obtained by removing some candidates from E is STC.*

Although r-STC is stricter than STC, it still contains both single-peaked and single-crossing preferences. This follows from the fact that both single peaked and single-crossing preferences are top monotonic and that single-peakedness and single-crossingness is preserved under the operation of removing candidates from the election.

3.2 Approval Elections

In the approval model we first recall the definitions of two classic domain restrictions, the voter-interval and the candidate-interval models [14].

Definition 9 (Voter-interval (VI) preferences). *Given an approval election instance $E = (N, C, k)$, we say that E has voter-interval preferences if there exists a linear order \sqsupset over N such that for all voters $v_1, v_2, v_3 \in N$ and for each candidate $c \in \text{top}_{v_1} \cap \text{top}_{v_3}$, we have that $v_1 \sqsupset v_2 \sqsupset v_3 \implies c \in \text{top}_{v_2}$. Intuitively, each candidate is approved by a consistent interval of voters.*

Definition 10 (Candidate-interval (CI) preferences). *Given an approval election instance $E = (N, C, k)$, we say that E has candidate-interval preferences if there exists a linear order \sqsupset over C such that for each voter $i \in N$ and all candidates $a, c \in \text{top}_i, b \in C$ we have that $a \sqsupset b \sqsupset c \implies b \in \text{top}_i$. Intuitively, each voter approves a consistent interval of candidates.*

Below we introduce a new class that generalizes both CI and VI domains. In Section 4.2 we will prove that the core is always nonempty if preferences come from this new domain.

Definition 11 (Linearly consistent (LC) preferences). *Given an approval election instance $E = (N, C, k)$, we say that E has linearly consistent preferences, if there exists a linear order \sqsupset over $N \cup C$ such that for each voters $i, j \in N$ ($i \sqsupset j$) and candidates $a, b \in C$ ($a \sqsupset b$), if $a \in \text{top}_j$, then $a \succ_i b$. In words, if i approves b and j approves a , then i approves a .*

Proposition 3. *Each VI or CI election is LC.*

In Appendix A.2 we compare the domain of linearly consistent preferences with the one of seemingly single-crossing (SSC) preferences [16]—yet another known class that generalizes VI and CI domains.

4 Finding Core-Stable Committees for Restricted Domains

In this section, we describe an algorithm for finding committees that takes as input preferences represented as weak orders. We will show that if the preferences are approval linearly consistent (LC), or strict recursive single-top-crossing (r-STC), then the returned committee belongs to the core. Our algorithm works in polynomial time, assuming that we are given the linear order \sqsupset over $N \cup C$, provided by the definitions of these preference classes. For approval preferences, such an order can be found in polynomial time for candidate-interval and voter-interval domains [16]. It is not known whether it is the case for general LC preferences—hence, for this class we show only the non-emptiness of the core. However, LC is mainly a technical domain, allowing us to present a coherent algorithm for both voter-interval and candidate-interval preferences. In case of r-STC preferences, the linear order witnessing this class is the same as the one witnessing top monotonicity which can be found in polynomial time [24].

Hereinafter we assume that the fraction n/k is integral. It is without loss of generality due to the following remark:

Remark 1. *Consider an election E and the instance E' obtained from E by multiplying each voter k times. If a committee is not in the core for E , it is not in the core for E' .*

The algorithm, which we call CORECOMMITTEE, consists of two phases: first we construct a fractional committee and then we discretize it. The first phase (further called the BESTREPRESENTATIVE algorithm) is the following: imagine that each voter has an equal probability portion k/n to distribute, and that we want to choose one candidate (her *representative*) who gets this portion. Initially, the fractional committee p is empty. We iterate over the set of voters, sorted according to the relation \sqsupset . Let P_i denote the set of unelected candidates at the moment of considering voter $i \in N$. The representative of i is defined as a candidate $r_i \in P_i$ such that for each $c \in P_i$ it holds that either $r_i \succ_i c$ or that $r_i \sim_i c$ and $r_i \sqsupset c$. Next, $p(r_i)$ is increased by k/n . Note that, as n/k is integral, the election probability of each candidate does not exceed 1.

In Section 4.1 we prove that after this phase the obtained fractional committee p is in the core for all strict elections and all LC approval elections. Denote by W_1 the set of candidates c such that $p(c) = 1$. Before the second phase of the algorithm, remove candidates from W_1 from the election together with the voters who are represented by them, obtaining a smaller election $E_2 = (N_2, C_2, k_2)$. By k_2 we denote $k - |W_1|$ (remaining seats in the committee) and by n_2 we denote $n - |W_1| \cdot n/k$ (remaining voters). Renumerate the voters so that they are numbers from $[n_2]$ (and in case of r-STC elections, resort them so that E_2 is still r-STC). Note that by definition $n_2/k_2 = (n - |W_1| \cdot n/k) / (k - |W_1|) = n \cdot (1 - |W_1|/k) / (k - |W_1|) = n/k$.

The second phase (further called the MEDIANRULE algorithm) is simple: for each $q \in [k_2]$ denote by m_q the $(q - 1) \cdot n/k + 1$ st voter. Further we will refer to these voters as *median voters*. Then elect committee $W_2 = \{r_{m_q} : q \in [k_2]\}$.

Finally, we return the committee $W = W_1 \cup W_2$. In Section 4.2 we show that the final committee W belongs to the core for LC and r-STC preferences.

4.1 Core Stability for Fractional Committees

We will now show that the committee elected by BESTREPRESENTATIVE is always in the core for LC approval elections and for all elections with strict preferences. The proof is the same for those two models; we only use the following property:

Definition 12. *Given an election $E = (N, C, k)$, we say that E is well-ordered, if there exists a linear order \sqsupset over $N \cup C$ such that for all voters $i, j \in N$ ($i \sqsupset j$) and candidates $a, b \in C$ ($a \sqsupset b$), if $a \sim_j b$ and $a, b \notin \text{bot}_j$, then $a \succ_i b$.*

It is clear that every strict election is well-ordered for every order \sqsupset (the premise is never satisfied). For approval elections this definition is a weakening of Definition 11 (because for approval elections $a \in \text{top}_j \implies a \notin \text{bot}_j$), hence every LC election is well-ordered.

For convenience, for $i \in N$ by p_i we denote the fractional committee p after considering voter i . Let $\sigma_i \in [m]$ be the number such that $r_i \in \text{pos}_i(\sigma_i)$. From how the algorithm BESTREPRESENTATIVE works, we have that for every voter $i \in N$ and a candidate $c \in \text{pos}_i([\sigma_i - 1])$ it holds that $p_{i-1}(c) = 1$ (and also $p_j(c) = 1$ for every $j \geq i$).

Theorem 1. *Each fractional committee elected by BESTREPRESENTATIVE belongs to the core for well-ordered elections.*

Proof. Let us start from the following remark, obtained naturally from the very construction of the algorithm.

Remark 2. *For each $i \in N$ and $c \in C$, there exists $q \in [n/k]$ such that $p_i(c) = q \cdot k/n$. In particular, q is the number of voters for whom c is a representative.*

We will prove the following invariant: for each $i \in N$, p_i satisfies the condition of the fractional core (see Definition 2) with the additional restriction that $S \subseteq [i]$. We will prove the invariant by induction.

For the first voter the invariant is clearly true. Assume, there exists $i \in N$ satisfying the invariant. We will prove that the invariant holds also for voter $(i + 1)$.

For the sake of contradiction suppose that there exists a group $S \subseteq [i + 1]$ and a fractional committee p'_{i+1} such that for each $v \in S$ we have that v lexicographically prefers p'_{i+1} to p_{i+1} .

First, note that if $(i + 1) \notin S$, then the invariant does not hold also for i , a contradiction. This is the case because the election probability of no candidate is decreased during a loop iteration. Hence, $(i + 1) \in S$.

By the definition of BESTREPRESENTATIVE we have that for each $\varrho < \sigma_{i+1}$ and $c \in \text{pos}_{i+1}(\varrho)$ it holds that $p_{i+1}(c) = 1$. From that, in particular we have the following equation:

$$\forall \varrho < \sigma_{i+1} \cdot p'_{i+1}(\text{pos}_{i+1}(\varrho)) \leq |\text{pos}_{i+1}(\varrho)| = p_{i+1}(\text{pos}_{i+1}(\varrho))$$

Hence, as $(i + 1)$ lexicographically prefers p' to p :

$$\forall \varrho < \sigma_{i+1} \cdot p'_{i+1}(\text{pos}_{i+1}(\varrho)) = p_{i+1}(\text{pos}_{i+1}(\varrho)) \quad (1)$$

It also needs to hold that:

$$p'_{i+1}(\text{pos}_{i+1}([\sigma_{i+1}])) > p_{i+1}(\text{pos}_{i+1}([\sigma_{i+1}])) \quad (2)$$

We can conclude that $\sigma_{i+1} < d_{i+1}$, as otherwise voter $(i + 1)$ could not prefer p'_{i+1} over p_{i+1} . Consequently:

$$r_{i+1} \notin \text{bot}_{i+1} \quad (3)$$

Suppose that $p'_{i+1}(r_{i+1}) = 0$. From (2) and the fact that for all $c \in \text{pos}_{i+1}(\sigma_{i+1})$ with $c \sqsupset r_{i+1}$ we have $p(c) = 1$, we infer that there exists $a \in \text{pos}_{i+1}(\sigma_{i+1})$ such that $r_{i+1} \sqsupset a$ and $p'_{i+1}(a) > 0$. From Remark 2 we have that $p'_{i+1}(a) \geq k/n$. Now we modify p'_{i+1} by moving the fraction of k/n from a to r_{i+1} . By Definition 12 and (3) we have that for every $v \in S$ (naturally, $v \sqsupset (i + 1)$) it holds that $r_{i+1} \succsim_v a$. Thus, after the change p'_{i+1} still witnesses core violation for S .

Now consider a fractional committee p'_i obtained from p'_{i+1} by decreasing the probability portion of r_{i+1} by k/n . We will show that p'_i together with $S \setminus \{(i + 1)\}$ witness the core violation for p_i . Indeed, the election probability of no candidate except r_{i+1} changed, and the election probability of r_{i+1} changed in the same way: in p_{i+1} and p'_{i+1} it is higher by k/n than in p_i and p'_i , respectively. Hence, if for a voter $v \in S$ it holds that $p'_{i+1} \triangleright_v p_{i+1}$, then also $p'_i \triangleright_v p_i$. Besides, we have that $p'_i(C) \leq k \cdot |S-1|/n$, so we obtain a contradiction with our inductive assumption. \square

4.2 Core Stability for Discrete Committees

In this section we present our main result: that the committee W elected by CORECOMMITTEE is in the core for LC and r-STC preferences. The algorithm for these two restricted domains is the same, but the proof techniques used for these models differ significantly.

The proof for LC elections heavily relies on the following two technical lemmas:

Lemma 1. *Given an LC election CORECOMMITTEE elects exactly k candidates.*

Proof. We will show that MEDIANRULE elects exactly k_2 candidates. Suppose for the sake of contradiction that there are two median voters i, j in E_2 such that $r_i = r_j$. Without loss of generality assume $i \sqsupset j$. Consider now any voter v between these median voters. If $r_v \sqsupset r_i$ then from the definition of LC, i approves r_v , and so r_v should be selected as i 's representative, a contradiction. If $r_j = r_i \sqsupset r_v$, then from the definition of LC, v approves r_j , and so r_j should be selected as v 's representative, a contradiction. Hence, $r_v = r_i$. But then we have that after running BESTREPRESENTATIVE, r_i was a representative for at least n/k voters and was not elected, a contradiction. \square

Lemma 2. *Let W be the committee elected by CORECOMMITTEE. For each $i \in N$, $|W \cap \text{top}_i| + 1 > p(\text{top}_i)$.*

Proof. Let us start with the following remark.

Remark 3. *Consider an LC election E and two voters i, j who were not removed from the election after the first phase, such that $i \sqsupset j$. Then either $r_i = r_j$ or $r_i \sqsupset r_j$.*

Indeed, towards a contradiction assume that $r_j \sqsupset r_i$. From LC we have that i approves r_j and r_j should be i 's representative.

Consider a voter $i \in N$. Define part_i as $p(\text{top}_i) - |W_1 \cap \text{top}_i|$. As W_1 contains all candidates c such that $p(c) = 1$, then part_i is intuitively the joint sum of election probabilities of partially elected candidates in top_i . From Remark 2 we have that:

$$\text{part}_i = q \cdot k/n \tag{4}$$

where q is the number of voters for whom a candidate from $\text{top}_i \setminus W_1$ is a representative. Naturally, such voters could not be removed from the election after the execution of BESTREPRESENTATIVE.

We will prove that $\text{part}_i < |W_2 \cap \text{top}_i| + 1$. From the fact that $W = W_1 \cup W_2$ and $W_1 \cap W_2 = \emptyset$, it will imply the desired statement. We will now focus on upper-bounding q from (4).

Consider three voters v_1, v_2, v_3 such that $v_1 \sqsupset v_2 \sqsupset v_3$ and $r_{v_1}, r_{v_3} \in \text{top}_i$. We will prove that then also $r_{v_2} \in \text{top}_i$. Indeed, from Remark 3 we have that either $r_{v_2} \in \{r_{v_1}, r_{v_3}\}$ (and the statement is true) or $r_{v_1} \sqsupset r_{v_2} \sqsupset r_{v_3}$. First, consider the case, when $v_2 \sqsupset i$. Since i approves r_{v_1} by LC applied to voters v_2, i and candidates r_{v_1} and r_{v_2} , we get that also v_2 approves r_{v_1} , a contradiction with Remark 3. Second, we look at the case when $i \sqsupset v_2$. From LC applied to v_2, i and candidates r_{v_2} and r_{v_3} and by the fact that i approves r_{v_3} we get that i also approves r_{v_2} , which is what we wanted to prove.

Hence, these q voters from (4) need to form a consistent interval among all non-removed voters. Besides, we know that there is no more than $|W_2 \cap \text{top}_i|$ median voters inside this interval and that between each two median voters there is $n/k - 1$ non-removed voters. Hence:

$$q \leq (|W_2 \cap \text{top}_i| + 1) \cdot (n/k - 1) + |W_2 \cap \text{top}_i| = (|W_2 \cap \text{top}_i| + 1) \cdot n/k - 1$$

and:

$$\text{part}_i = q \cdot k/n < (|W_2 \cap \text{top}_i| + 1) \cdot n/k \cdot k/n = |W_2 \cap \text{top}_i| + 1$$

which completes the proof. \square

Theorem 2. *For LC elections, CORECOMMITTEE elects committees from the core.*

Proof. We know that fractional committee p elected by BESTREPRESENTATIVE belongs to the core. Suppose now that W is not in the core. Hence, there exists a nonempty set $S \subseteq N$ and a committee T of size $|S| \cdot k/n$ such that $|W \cap \text{top}_i| < |T \cap \text{top}_i|$ for each $i \in S$ —alternatively, $|W \cap \text{top}_i| + 1 \leq |T \cap \text{top}_i|$.

From Lemma 2 we know that for each $i \in S$ we have $p(\text{top}_i) < |W \cap \text{top}_i| + 1 \leq |T \cap \text{top}_i|$. Let us define a fractional committee p' such that $p'(c) = 1$ for $c \in T$ and $p'(c) = 0$ otherwise. Hence, S and p' witness the violation of the core for p , which is contradictory with Theorem 1. \square

For r -STC elections, we again start with proving two technical lemmas:

Lemma 3. CORECOMMITTEE for strict r -STC election E elects exactly k candidates.

Proof. We need to show that MEDIANRULE elects exactly k_2 candidates. Suppose for the sake of contradiction that there are two median voters i, j in E_2 such that $r_i = r_j$. From STC it follows that $r_v = r_i$. But this means that after running BESTREPRESENTATIVE, r_i was a representative for at least n/k voters and was not elected, a contradiction. \square

Lemma 4. Consider an STC election $E = (N, C, k)$ and apply MEDIANRULE to E to obtain the committee W . If $|W| = k$, then W is in the core.

Proof. Towards a contradiction suppose that the statement of the lemma is not true. Without loss of generality, assume that E is an election with the smallest k among those for which the statement of the lemma does not hold. Let S and T be subsets of voters and candidates, respectively, that witness that the committee returned by the median rule does not belong to the core.

Observe that there are at least two candidates from W that do not belong to T . Indeed, if there were only one such candidate, we would have that $|T| = |W|$ (as $T \setminus W$ is nonempty) and $|S| = n$. In particular, in such a case all median voters would belong to S . Consequently, the most preferred candidates of the median voters would belong to T , hence $W \subseteq T$, a contradiction.

Let us fix a candidate $a \in W \setminus T$ that is elected by the greatest median voter ($i \cdot n/k + 1$). In particular, $i \neq 0$. For a candidate $b \in T$ by $S_b \subseteq S$ we denote the subset of voters in S preferring b to a . Since E is single-top-crossing, it holds that either $S_b \subseteq [i \cdot n/k]$ or $S_b \subseteq N \setminus [i \cdot n/k]$.

Now we split E into two smaller elections $E_{\text{low}} = ([i \cdot n/k], C, i)$ and $E_{\text{grt}} = (N \setminus [i \cdot n/k], C, k - i)$. By W_{low} and W_{grt} we denote the committees elected by the median rule for E_{low} and E_{grt} , respectively. Observe that $W_{\text{low}} \sqcup W_{\text{grt}} = W$.

Let us also split S and T into two parts, as follows:

$$\begin{aligned} S_{\text{low}} &= S \cap [i \cdot n/k], & S_{\text{grt}} &= S \cap (N \setminus [i \cdot n/k]), \\ T_{\text{low}} &= \{c \in T : S_c \subseteq [i \cdot n/k]\}, & T_{\text{grt}} &= \{c \in T : S_c \subseteq N \setminus [i \cdot n/k]\}. \end{aligned}$$

Note that $S_{\text{low}} \cup S_{\text{grt}} = S$ and $T_{\text{low}} \cup T_{\text{grt}} = T$. Hence, if we had that both $|T_{\text{low}}| > |S_{\text{low}}| \cdot n/k$ and $|T_{\text{grt}}| > |S_{\text{grt}}| \cdot n/k = (|S| - |S_{\text{low}}|) \cdot n/k$, then we would have also $|T| > |S| \cdot n/k$, a contradiction. Hence, for at least one of the pairs $(S_{\text{low}}, T_{\text{low}})$, $(S_{\text{grt}}, T_{\text{grt}})$ the opposite inequality holds. Without the loss of generality, assume that $|T_{\text{low}}| \leq |S_{\text{low}}| \cdot n/k$.

We claim that the pair $(S_{\text{low}}, T_{\text{low}})$ witnesses the core violation for E_{low} and committee W_{low} .

Consider a voter $j \in S_{\text{low}}$. We know that there exists a candidate $c \in T \setminus W$ such that $c \succ_j W \setminus T$. First observe that W_{low} and T_{grt} are disjoint—indeed, for every candidate $b \in T_{\text{grt}}$ we have that $S_b \subseteq N \setminus [i \cdot n/k]$. As a result, there is no median voter in $[i \cdot n/k]$ who prefers b to a , hence $b \notin W_{\text{low}}$. From this fact we conclude that $W_{\text{low}} \setminus T_{\text{low}} = W_{\text{low}} \setminus T \subseteq W \setminus T$. Consequently, $c \succ_j W_{\text{low}} \setminus T_{\text{low}}$.

Further, observe that $c \in T_{\text{low}}$. Indeed, voter j prefers c to $W \setminus T$, thus in particular j prefers c to a . Consequently, $j \in S_c$, and thus $S_c \subseteq S_{\text{low}}$, from which we get that $c \in T_{\text{low}}$. Since $c \in T_{\text{low}}$ and $c \succ_j W_{\text{low}} \setminus T_{\text{low}}$, we get that j lexicographically prefers T_{low} to W_{low} .

Finally, we obtain that if the core was violated for E , it also needs to be violated for E_{low} , which is contradictory to our assumption that E minimizes the value of k . \square

Theorem 3. *For r -STC elections, CORECOMMITTEE elects committees from the core.*

Proof. From Lemma 4, we conclude that in CORECOMMITTEE algorithm, W_2 is in the core for E_2 .

For the sake of contradiction suppose that the statement of the theorem is not true. Then there exist a set $S \subseteq N$ and a set $T \subseteq C$ witnessing the violation of the condition of the core. For every candidate $c \in C$, by $R(c)$ we denote set $\{i \in N : r_i = c\}$. Note that for a candidate $c \in W_1$ and a voter $i \in S$ such that $i \in R(c)$, we have $c \in T$. Hence, $S \cap \bigcup_{c \in T \cap W_1} R(c) = S \cap \bigcup_{c \in W_1} R(c)$. Consider now sets $S \cap N_2$ and $T \cap C_2$. It holds that:

$$\begin{aligned} |T \cap C_2| &= |T| - |T \cap W_1| \leq |S| \cdot k/n - \left| \bigcup_{c \in T \cap W_1} R(c) \right| \cdot k/n \\ &\leq |S| \cdot k/n - |S \cap \bigcup_{c \in T \cap W_1} R(c)| \cdot k/n \\ &\leq |S \setminus \bigcup_{c \in W_1} R(c)| \cdot k/n = |S \cap N_2| \cdot k/n = |S \cap N_2| \cdot k_2/n_2. \end{aligned}$$

Further, for each voter $i \in S \cap N_2$ we have that $(T \triangleright_i W) \wedge (W_1 \subseteq T) \implies (T \cap C_2) \triangleright_i W_2$. Consequently, $S \cap N_2$ and $T \cap C_2$ witness the violation of the core condition for committee W_2 , which is contradictory to Lemma 3 and Lemma 4. \square

Corollary 1. *The core is always nonempty and can be found in polynomial time for the following classes of voters' preferences: (1) voter-interval, (2) candidate-interval, and (3) recursive single-top-crossing. For linearly consistent voters' preferences, the core is always nonempty.*

In Theorem 4 below we show that the condition of recursiveness in the definition of the class of r -STC preferences is necessary for the nonemptiness of the core. Thus, in a way Theorem 3 gives a rather precise condition on the existence of the core-stable committees for strict voters' preferences. For approval preferences one cannot easily argue that the conditions are precise, since it is still a major open question whether a core-stable committee exists in each approval election.

Theorem 4. *There exists a top-monotonic election with strict preferences, where the core is empty.*

Proof. Let A be a Condorcet cycle of $r = 100$ candidates:

$$\begin{aligned} a_1 &\succ a_2 \succ \dots \succ a_r \\ a_2 &\succ a_3 \succ \dots \succ a_r \succ a_1 \\ &\dots \\ a_r &\succ a_1 \succ a_2 \succ \dots \succ a_{r-1} \end{aligned}$$

Now let B, C, D, E and F be five clones of A . Thus in $A \cup B \cup \dots \cup F$ we have $6r = 600$ candidates. We add two more candidates, namely g and h .

Consider the following profile with 600 voters:

$$\begin{aligned} g &\succ A \succ B \succ C \succ D \succ E \succ F \succ h \\ g &\succ B \succ C \succ A \succ E \succ F \succ D \succ h \\ g &\succ C \succ A \succ B \succ F \succ D \succ E \succ h \\ h &\succ D \succ E \succ F \succ A \succ B \succ C \succ g \\ h &\succ E \succ F \succ D \succ B \succ C \succ A \succ g \\ h &\succ F \succ D \succ E \succ C \succ A \succ B \succ g \end{aligned}$$

For example, the first two votes in this profile are:

$$\begin{aligned}
&g \succ a_1 \succ \dots \succ a_r \succ b_1 \succ \dots \succ b_r \succ \dots \succ f_1 \succ \dots \succ f_r \succ h \\
&g \succ a_2 \succ \dots \succ a_r \succ a_1 \succ b_2 \succ \dots \succ b_r \succ b_1 \succ \dots \succ f_2 \succ \dots \succ f_r \succ f_1 \succ h
\end{aligned}$$

The above profile is single-top-crossing since there are only two top-candidates, g and h , and each of them crosses with each other candidate only once.

Let $k = 7$, and consider a committee W . We will show that W does not belong to the core. Without loss of generality, we can assume that $g, h \in W$, as there exists more than $600/7$ voters who rank each of these candidates as their favourite one. Further, since the profile is symmetric, without loss of generality we can also assume that it contains at most two candidates from $A \cup B \cup C$. If the two candidates belong to the same clone, say A , then we take a candidate $c \in C$, and observe that 200 voters (the second and the third group) prefer $\{c, g\}$ over W . Otherwise, if the two candidates are from two different clones, say A and B (the situation is symmetric), then we take the clone which is preferred by the majority (in this context A) and select the candidate $a \in A$ that is preferred by $r - 1$ voters to the member of $W \cap A$. There are $2r - 2 = 198$ voters who prefer $\{g, a\}$ to W . Thus, W does not belong to the core. \square

5 Conclusions and Open Questions

In this work we have determined the existence of core-stable committees for a number of restricted domains both in the approval and in the ordinal models of voters' preferences. We have additionally presented a number of results that give better insights into the structures of the known domains. In particular, our results give a better understanding of the class of top-monotonic preferences. Let us conclude with two open questions that we find particularly important.

In Appendix C we show that classic committee election rules that are commonly considered proportional are not core-stable even if the voters' preferences come from certain restricted domains. Since these domains are natural and can be intuitively explained, one would expect a good rule to behave well for such well-structured elections. This leads us to the following important open question.

Question 1. *Is there a natural voting rule that satisfies the strongest axioms of proportionality, and which at the same time satisfies the core for restricted domains?*

The requirement that a rule should be "natural" says in particular that its definition cannot conditionally depend on whether the election at hand comes from a restricted domain. Question 1 is valid for both approval and ordinal preferences.

Additionally, it would be interesting to check how often the classic rules violate the core, especially in the case of restricted domains. One can make such a quantitative comparison via experiments. This however raises the algorithmic questions of how hard it is to verify if a given committee (in our case the committee returned by the particular rule) belongs to the core.

Question 2. *What is the computational complexity of deciding whether a given committee belongs to the core?*

This question is interesting for each preference domain studied in this work.

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A Additional Discussion

A.1 Core and (Full) Local Stability

Aziz et al. [3] proposed the concept of *full local stability*, which is equivalent to the definition of core-stability for ordinal preferences. Interestingly, while the concept of the core has been studied before in the context of ordinal committee elections, the equivalence of the two concepts has never been claimed so far. Yet, most of the results in the work of Aziz et al. [3] are formulated for the concept of *local stability*. Interestingly, this concept is also equivalent to the core-stability, but for a different preference extension: we say that voter i weakly prefers W over T according to \triangleright^{\max} preference extension if and only if she ranks her most preferred candidate in W as high as her most preferred candidate in T . In words, according to the \triangleright^{\max} extension we focus only on the single top preferred candidate in the committee and do not break ties lexicographically.

Definition 13 (Local stability). *Consider an election E and a value $q \in \mathbb{Q}$. A committee W violates local stability for quota q if there exists a group $S \subseteq N$ with $|S| \geq q$ and a candidate $c \in C \setminus W$ such that each voter from S prefers c to each member of W .*

Proposition 4. *Local stability for quota $\lceil n/k \rceil$ is equivalent to core stability for the \triangleright^{\max} preference extension.*

Proof. The fact the core stability with \triangleright^{\max} implies local stability is straightforward—local stability is a special case of the core condition for $|T| = 1$. Now consider any election E and a committee W that is not core stability with \triangleright^{\max} . Let $S \subseteq N$ and $T \subseteq C$ be the witness that W is not in the core. For a candidate $c \in T$ let $R_c \subseteq S$ denote a set of voters i such that $c \succ_i W$. Since for every $i \in S$ there exists $c \in T$ with $i \in R_c$:

$$|S| \leq \sum_{c \in T} |R_c|$$

Hence, there exists a candidate $c \in T$ such that $|R_c| \geq |S|/|T| \geq n/k$. Yet, R_c together with the candidate c witness the violation of local stability, which completes the proof. \square

Note that Question 2 is easy for the \triangleright^{\max} preference extension.

Proposition 5. *There exists a polynomial-time algorithm for deciding whether a given committee belongs to the core for the \triangleright^{\max} preference extension.*

Proof. Given a committee W it is sufficient to iterate over all candidates $c \in C \setminus W$ and check if the number of voters who prefer c over W is no-greater than $\lceil n/k \rceil$. \square

However, for the lexicographic preference extension the question is much less obvious.

A.2 Linearly Consistent vs Seemingly Single-Crossing Preferences

Let us now compare the domain of linearly consistent preferences with the one of *seemingly single-crossing* (SSC) preferences [16]—another known class that generalizes VI and CI domains. We say that preferences are seemingly single-crossing if there is a linear order over voters such that for each $a, b \in C$, the voters approving a and not b either all succeed or all precede the voters approving b and not a . Observe that LC implies SSC. The reverse implication does not hold, as we show in Example 1 below.

Example 1. *Consider the election instance with 3 voters and the following preferences:*

$$v_1: \{a, c\} \quad v_2: \{a, b\} \quad v_3: \{b, c\}$$

It is straightforward to check that these preferences are SSC for all pairs of candidates and any linear order over voters.

Suppose that this election instance is LC and let \sqsupset be the required linear order over $N \cup C$. Without loss of generality, let $a \sqsupset b$. Then we have that $v_1, v_2 \sqsupset 3$ (otherwise, LC would be violated for voter v_3 , a voter $j \in \{v_1, v_2\}$ such that $v_3 \sqsupset j$, and candidates a, b).

Further, suppose that $b \sqsupset c$. Then, voters v_1 and v_3 together with candidates b, c witness the violation of LC, a contradiction. Hence, $c \sqsupset b$. But then, voters v_2 and v_3 together with candidates b, c witness the violation of LC. The obtained contradiction completes the proof.

B Omitted proofs

Proposition 1. *For strict rankings, single-top-peakedness is equivalent to top-monotonicity.*

Proof. Observe that the first condition in the definition of TM implies STP. Now, we will show the reverse implication. Consider an STP election. We will show that it satisfies the two conditions specified in Definition 5.

Note that in the strict model if the premise of the first condition is satisfied, then $\text{top}_i = \{a\}$ and $\text{top}_j = \{b\}$ and $c \notin \text{top}_i \cup \text{top}_j$. Hence, the first condition follows from the condition for STP.

Consider now the second condition. If $a \succ_i b, c$ and $b \succ_j a, c$, then in the strict model it holds that $a \succ_i b, c$ and $b \succ_j a, c$. Let us consider two cases: first assume that $a \sqsupset b \sqsupset c$. We know that $\text{top}_i = \{d\}$ for some $d \in C \setminus \{b, c\}$. If $d \sqsupset b$, then $b \succ_i c$ follows from the definition of STC (for voter i and candidates d, b, c). Suppose now that $b \sqsupset d$. But then from the definition of STP (for voter i and candidates a, b, d) we obtain that $b \succ_i a$, a contradiction. The reasoning for the case when $c \sqsupset b \sqsupset a$ is analogous. \square

Proposition 2. *For strict rankings, single-top-peakedness is equivalent to single-top-crossingness.*

Proof. Consider an STC election E and a linear order \sqsupset over voters given by the definition of STC. We say that i precedes j if $j \sqsupset i$. We construct the linear order over candidates as follows:

1. Consider some $a, b \in C$ such that a is the top preference for some voter $i \in N$. From the definition of STC, we know that voters preferring b to a can all either succeed or precede i . If they succeed i , then we add constraint $b \sqsupset a$, otherwise we add constraint $a \sqsupset b$. If there are no voters preferring b to a , we add no constraint. We repeat this step for each pairs $a, b \in C$.
2. Finally, if after the previous step some pairs are still incomparable, we complete the order in any transitive way.

We will show that the constraints placed during the first step of the procedure are transitive. Indeed, consider (for the sake of contradiction) three candidates a, b, c such that the procedure placed constraints $a \sqsupset b$, $b \sqsupset c$ and $c \sqsupset a$. Hence, we know that at least two out of these three candidates are top candidates. Assume without the loss of generality that a and b are top candidates. Let i_a, i_b be voters ranking top respectively a and b (naturally, $i_a \sqsupset i_b$). We know that all the voters preceding i_a prefer a to c and all the voters preceding i_b prefer c to b . There exists at least one voter i preferring c to b (as otherwise constraint $b \sqsupset c$ would not be added) and $i_b \sqsupset i$. By transitivity of the preference relation, we know that i prefers a over b . Consequently, i_a, i_b and i together with candidate a witness STC violation. The obtained contradiction shows that the order \sqsupset is indeed transitive.

We will now prove that such linear order \sqsupset over candidates satisfies the conditions of STP. Indeed, consider any three candidates $a \sqsupset b \sqsupset c$ such that b is a top candidate and a voter $i \in N$. Let $\text{top}_i = \{a\}$. As b is a top candidate, there exists a voter j such that $\text{top}_j = \{b\}$. As $a \sqsupset b$, it holds that $i \sqsupset j$. Then if we had that $c \succ_i b$, our procedure would place constraint $c \sqsupset b$, a contradiction. Hence $b \succ_i c$. The proof for the case $\text{top}_i = \{c\}$ is analogous.

Now we will prove the reverse implication. Let E be an STP election with a linear order \sqsupset over the candidates. Consider the following linear order \sqsupset over the voters: for each $i, j \in N$ we have that if $\text{top}_i \sqsupset \text{top}_j$ then $i \sqsupset j$. Now consider three voters x, y, z and a candidate a such that $a \succ_x \text{top}_y$. Suppose that $a \sqsupset \text{top}_y$. Then from the properties of top monotonicity and the fact that $\text{top}_y \sqsupset \text{top}_z$, we have that z has preference ranking $\text{top}_z \succ_z \text{top}_y \succ_z a$. Suppose now that $\text{top}_y \sqsupset a$. But since $\text{top}_x \sqsupset \text{top}_y \sqsupset a$, the fact that $a \succ_x \text{top}_y$ leads to the contradiction with the definition of top monotonicity, which completes the proof. \square

Proposition 3. *Each VI or CI election is LC.*

Proof. The case of voter-interval preferences. Let \sqsupset be a linear order over N that witnesses that preferences are voter-interval. Let us sort N by this order. For each candidate c , by first_c we denote $\min\{i \in N : c \in \text{top}_i\}$. Let us now associate each candidate c to first_c (breaking the tie between c and first_c arbitrarily). If two candidates a, b are associated to the same point, we also break the tie between them arbitrarily. In such a way we obtained an order \sqsupset over $N \cup C$. For simplicity, for each $x, y \in N \cup C$ we denote " $x \sqsupset y$ or $x = y$ ".

Consider two voters, i and j , with $i \sqsupset j$, and two candidates, a and b , with $a \sqsupset b$. Assume i approves b and j approves a . We will prove that i approves a . Since $a \sqsupset b$, by our definition $\text{first}_a \sqsupseteq \text{first}_b$. Since i approves b , $\text{first}_b \sqsupseteq i$, and so $\text{first}_a \sqsupseteq i$. If $i = \text{first}_a$, then i approves a . Otherwise, $\text{first}_a \sqsupset i$. Consequently, first_a, i , and j are three voters, such that $\text{first}_a \sqsupset i \sqsupset j$. Since the preferences are voter-interval we infer that i approves a .

The case of candidate-interval preferences. Let \sqsupset be a linear order on C witnessing the candidate-interval property. Let us sort C by this order. We associate each voter $i \in N$ with $(\min \text{top}_i)$, again breaking all the ties arbitrarily. Consider two voters, i and j with $i \sqsupset j$, and two candidates a and b , with $a \sqsupset b$. Further, assume that i approves b and j approves a . Since $i \sqsupset j$, we get that $(\min \text{top}_i) \sqsupseteq (\min \text{top}_j)$, and since j approves a , we have $(\min \text{top}_j) \sqsupseteq a$. Consequently, $(\min \text{top}_i) \sqsupseteq a$. If $(\min \text{top}_i) = a$, then i approves a . Otherwise, $(\min \text{top}_i) \sqsupset a$ and b are three candidates, such that $(\min \text{top}_i) \sqsupset a \sqsupset b$. Given that preferences are candidate-interval, and that i approves b , we get that i approves a . \square

C Known Rules are not Core-Stable under Restricted Domains

C.1 Strict Preferences

To the best of our knowledge, none of the known voting rules is core-stable, even for 1D-Euclidean elections (more restricted than the intersection of single-peaked and single-crossing preferences). We prove this for two archetypal proportional rules, the Monroe's rule and STV.

Definition 14 (The Monroe's Rule). *Consider an election E with strict preferences and assume that n/k is integral. For a committee $T \subseteq C$, a balanced matching is a collection of subsets of voters $\{N_c\}_{c \in T}$ such that $\bigcup_{c \in T} N_c = N$ and for every $c \in T$, $|N_c| = n/k$. The value of a matching is equal to $|\{(c, i, c') : c \in T, i \in N_c, c' \succ_i c\}|$. The matching $\{N_c\}_{c \in T}$ is minimal, if it has the minimal value among all matchings for T . The Monroe's Rule returns the committee W minimizing the value of the minimal balanced matching.*

Definition 15 (Single Transferable Vote (STV)). *Consider an election E with strict preferences. STV proceeds sequentially: at each round we elect a candidate that is ranked top by at least $n/(k+1) + 1$ voters and remove any $n/(k+1) + 1$ of these voters from the election. If there are no such candidates, we remove from the election a candidate ranked top by the least number of voters.*

Both the Monroe's Rule and STV are not core-stable even for 1D-Euclidean instances, as shown in Example 2 and Example 3, respectively.

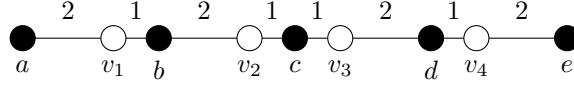


Figure 1: An illustration of Example 2. White and black points mean the positions of respectively the voters and the candidates.

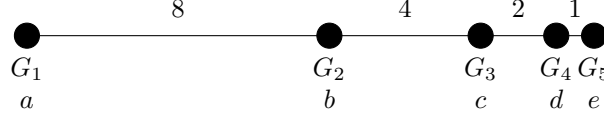


Figure 2: An illustration of Example 3. Black points mean the positions of both candidates and groups of voters (ties can be broken arbitrarily).

Example 2. Let $k = 2$. Voters' preferences are the following:

$$\begin{aligned} v_1: b \succ a \succ c \succ d \succ e \\ v_2: c \succ b \succ d \succ a \succ e \\ v_3: c \succ d \succ b \succ e \succ a \\ v_4: d \succ e \succ c \succ b \succ a \end{aligned}$$

This instance is 1D-Euclidean as presented in Figure 1.

Here the committee $\{b, d\}$ is elected by the Monroe's Rule ($N_b = \{v_1, v_2\}$, $N_d = \{v_3, v_4\}$), but group S consisting of middle voters $\{v_2, v_3\}$ and $T = \{c\}$ witness the core violation.

Example 3. Let $n = 60$, $k = 2$. The value of the STV quota is $n/(k+1) + 1 = 21$. Voters' preferences are divided into 5 groups:

$$\begin{aligned} G_1 \text{ (18 voters): } & a \succ b \succ c \succ d \succ e \\ G_2 \text{ (7 voters): } & b \succ c \succ d \succ e \succ a \\ G_3 \text{ (5 voters): } & c \succ d \succ e \succ b \succ a \\ G_4 \text{ (16 voters): } & d \succ e \succ c \succ b \succ a \\ G_5 \text{ (14 voters): } & e \succ d \succ c \succ b \succ a \end{aligned}$$

This instance is 1D-Euclidean as presented in Figure 2.

Here candidate c is eliminated at the first round and all votes for her are transferred to d . Second, candidate d is elected (in the second round she gains exactly 21 votes) and the votes from groups 3 and 4 are removed. Third, candidate b is eliminated and all votes for her are transferred to e . Fourth, candidate e is elected (gaining in the final round exactly 21 votes) and the committee $\{d, e\}$ is returned. However, 30 voters from the three first groups and candidate c witness the core violation.

C.2 Approval Preferences

As in the case of strict preferences, we first show that two known proportional voting rules are not core stable even if the preferences come from the intersection of VI and CI domains. We focus on known rules that satisfy extended justified representation (EJR) [2], one of the strongest proportionality axioms that are known to be satisfiable in general.

Definition 16 (Proportional Approval Voting (PAV) [33]). *Given an election instance $E = (N, C, k)$, we elect a committee W maximizing the value of the following expression:*

$$\sum_{i \in N} H(|W \cap \text{top}_i|) \quad \text{where} \quad H(i) = 1 + \frac{1}{2} + \dots + \frac{1}{i}.$$

Definition 17 (Rule X [27]). *We assume that each voter is given 1 dollar at the beginning. Every candidate needs to be paid n/k dollars to be elected. The algorithm is sequential. At each round, we iterate over candidates and for each candidate c we compute the value ϱ_c —the lowest value such that the voters approving c can afford her election (i.e., can afford to pay n/k dollars in total) provided each voter pays at most ϱ_c . Then we elect the affordable candidate minimising ϱ_c , decrease the voters' budgets and repeat the procedure until there are no affordable candidates.*

Both these rules are not core-stable even for elections belonging to the intersection of VI and CI classes, as shown in Example 4 and Example 5.

Example 4. *Let $n = 3$, $k = 8$. Voters' preferences are the following:*

$$\begin{aligned} v_1 &: \{b_1, b_2, b_3, b_4, a\} \\ v_2 &: \{b_1, b_2, b_3, b_4, c\} \\ v_3 &: \{d_1, d_2, d_3, d_4\} \end{aligned}$$

Assuming

$$v_1 \sqsupseteq v_2 \sqsupseteq v_3$$

and

$$a \sqsupseteq b_1 \sqsupseteq \dots \sqsupseteq b_4 \sqsupseteq c \sqsupseteq d_1 \sqsupseteq \dots \sqsupseteq d_4,$$

it is clear that the instance is both VI and CI.

Here PAV elects candidates $\{b_1, \dots, b_4, d_1, \dots, d_4\}$. However, this committee does not belong to the core, which is witnessed by the groups $S = \{v_1, v_2\}$ and $T = \{a, b_1, \dots, b_4, c\}$.

Example 5. *Let $n = 42$, $k = 14$. Voters' preferences are divided into the following groups:*

$$\begin{aligned} G_1 \text{ (1 voter)} &: \{c_1, c_2, c_3, x_1, x_2\} \\ G_2 \text{ (8 voters)} &: \{c_1, c_2, c_3, x_1, x_2, a_1, a_2, a_3, a_4\} \\ G_3 \text{ (12 voters)} &: \{c_1, c_2, c_3, a_1, a_2, a_3, a_4, b_1, b_2, b_3, b_4, e_1, e_2\} \\ G_4 \text{ (12 voters)} &: \{d_1, d_2, d_3, b_1, b_2, b_3, b_4, a_1, a_2, a_3, a_4, e_1, e_2\} \\ G_5 \text{ (8 voters)} &: \{d_1, d_2, d_3, y_1, y_2, b_1, b_2, b_3, b_4\} \\ G_6 \text{ (1 voter)} &: \{d_1, d_2, d_3, y_1, y_2\} \end{aligned}$$

Assuming

$$G_1 \sqsupseteq G_2 \sqsupseteq \dots \sqsupseteq G_6 \text{ (the voters within each group can be ordered arbitrarily)}$$

and

$$x_1 \sqsupseteq x_2 \sqsupseteq c_1 \sqsupseteq c_2 \sqsupseteq c_3 \sqsupseteq a_1 \sqsupseteq \dots \sqsupseteq a_4 \sqsupseteq e_1 \sqsupseteq e_2 \sqsupseteq b_1 \sqsupseteq \dots \sqsupseteq b_4 \sqsupseteq d_1 \sqsupseteq d_2 \sqsupseteq d_3 \sqsupseteq y_1 \sqsupseteq y_2$$

it is clear that the instance is both VI and CI.

At the beginning each voter has 1 dollar and the price for candidates is $p = n/k = 3$. First we elect candidates $a_1, \dots, a_4, b_1, \dots, b_4$; for each of them 32 out of 40 middle voters pay (each of them pays $3/32$). Second, we elect candidates e_1 and e_2 , and the middle 24 voters run out of money; indeed, each of them pays $8 \cdot 3/32 + 2 \cdot 3/24 = 1$ for the so far elected candidates. Next we elect candidates x_1, x_2, y_1, y_2 . We have elected the committee $\{a_1, \dots, a_4, b_1, \dots, b_4, e_1, e_2, x_1, x_2, y_1, y_2\}$ which is not even Pareto-optimal as the committee $\{a_1, \dots, a_4, b_1, \dots, b_4, c_1, c_2, c_3, d_1, d_2, d_3\}$ is better for every voter. Thus, in particular the elected committee does not belong to the core.