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Towards less manipulable voting systems

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Note to the reader

This is a (rather quick) translation of the original French version of this memoir, which is entitled: "Vers des modes de scrutin moins manipulables". I apologize for the possible spelling and grammar mistakes in this English version.

Abstract

We investigate the coalitional manipulation of voting systems: is there a subset of voters who, by producing an insincere ballot, can secure an outcome that they strictly prefer to the candidate who wins if all voters provide a sincere ballot?

From a theoretical point of view, we develop a framework that allows us to study all kinds of voting systems: ballots can be linear orders of preferences over the candidates (ordinal systems), grades or approval values (cardinal systems) or even more general objects. We prove that for almost all voting systems from literature and real life, manipulability can be strictly diminished by adding a preliminary test that elects the Condorcet winner if one exists. Then we define the notion of decomposable culture and prove that it is met, in particular, when voters are independent. Under this assumption, we prove that for any voting system, there exists a voting system that is ordinal, has some common properties with the original voting system and is at most as manipulable. As a consequence of these theoretical results, when searching for a voting system whose manipulability is minimal (in a class of reasonable systems), investigation can be restricted to those that are ordinal and meet the Condorcet criterion.

In order to provide a tool to investigate these questions in practice, we present SWAMP, a Python package we designed to study voting systems and their manipulability. We use it to compare the coalitional manipulability of several voting systems in a variety of cultures, i.e. probabilistic models generating populations of voters with random preferences. Then we perform the same kind of analysis on real elections. Lastly, we determine voting systems with minimal manipulability for very small values of the number of voters and the number of candidates and we compare them with classical voting systems from literature and real life. Generally speaking, we show that the Borda count, Range voting and Approval voting are especially vulnerable to manipulation. In contrast, we find an excellent resilience to manipulation for the voting system called IRV (also known as STV) and its variant Condorcet-IRV.

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Publications

Communications in a conference

François Durand, Benoît Kloeckner, Fabien Mathieu, and Ludovic Noirie. Geometry on the utility sphere. In *Proceedings of the 4th International Conference on Algorithmic Decision Theory (ADT)*, 2015.

François Durand, Fabien Mathieu, and Ludovic Noirie. Élection du best paper AlgoTel 2012: étude de la manipulabilité. In AlgoTel 2014 – 16èmes Rencontres Francophones sur les Aspects Algorithmiques des Télécommunications, 2014.

François Durand, Fabien Mathieu, and Ludovic Noirie. Élection d'un chemin dans un réseau: étude de la manipulabilité. In AlgoTel 2014 – 16èmes Rencontres Francophones sur les Aspects Algorithmiques des Télécommunications, 2014.

François Durand, Fabien Mathieu, and Ludovic Noirie. On the manipulability of voting systems: application to multi-operator networks. In *Proceedings of the 9th International Conference on Network and Service Management (CNSM)*, pages 292–297. IEEE, 2013.

Poster

François Durand, Fabien Mathieu, and Ludovic Noirie. Reducing manipulability. Poster presented during the 5th International Workshop on Computational Social Choice (COMSOC), 2014.

Communication in a work group

François Durand, Fabien Mathieu, and Ludovic Noirie. Manipulability of voting systems. Work group Displexity, http://www.liafa.univ-paris-diderot.fr/~displexity/docpub/6mois/votes.pdf, 2012.

Research reports

François Durand, Fabien Mathieu, and Ludovic Noirie. Making most voting systems meet the Condorcet criterion reduces their manipulability. https://hal.inria.fr/hal-01009134, 2014.

François Durand, Fabien Mathieu, and Ludovic Noirie. Making a voting system depend only on orders of preference reduces its manipulability rate. https://hal.inria.fr/hal-01009136, 2014.



Introduction

When voting systems are mentioned, it evokes immediately the elections giving pace to our public life. However, elections are far from limited to the political field: they can be used in any situation where a given set of agents, the *voters*, want to choose collectively one option among several possibilities, the *candidates*. Thus, elections can be used to designate the best restaurant or the best movie. They can be used in associations of professional organizations. And the development of organizations crossing the physical borders thanks to the Internet and also needing to designate representatives makes public life richer and leads to form of democracy that are independent of States. For example, the Debian project¹, the Ubuntu community², Wikipedia France fundation³, the website www.boardgamegeek.com and many others use Schulze's method, a voting system developed in 1997, and are for this reason at the cutting edge of experimentation for innovating voting systems.

In a time where there is an increasing abstention, even the country where the Declaration of the Rights of Man and of the Citizen came from, whereas, in other countries, people fight for their right to vote; in a time where voters from our developed countries show an increasing mistrust about the political class, and where classic voting systems do not seem to satisfy all desires of expression; finally, in a time where the possibilities offered by electronic voting, still in their infancy, make it possible to consider, in the near future, the use of voting system whose counting is more complex, it seems more urgent than ever to take time to think about the procedures that are used to vote, i.e. voting systems themselves.

Simple majority vote

In this memoir, we will always use the word *candidates* to designate the different options that are proposed to the voters, even when they are not persons aspiring to a position. The simplest situation happens when voters are to answer to a binary question by yes or no.

Since at least the Athenian democracy, during the Age of Pericles (v^{th} century B.C.), such decisions have been made using the simple majority vote. It was so in the main Athenian assemblies:

- The Ecclésia (κκλησία), the assembly of all citizens, meeting on the Pnyx Hill about 40 times a year;
- The Boulè (βουλή), a restrict council consisting of 50 members drawn at random who meet daily to deal with current matters;

¹www.debian.org/.

²www.ubuntu-fr.org/.

³fr.wikipedia.org/.

And the dikastéria (δικαστήρια), popular jurors drawn at random, responsible to judge specific litigations and also to discuss the legality of decrees, thus prefiguring the current jurors as well as institutions such as the current Constitutional Council (for France) or the European Court of Human Rights Rights (for the EU).

In the case of a closed question, the simple majority vote was very soon presented as evidence.

Of course, there is another case where there are only two candidates: when two real candidates in the usual sense, that is to say two human beings, are placed in competition and subject to the opinion of the voters.

May (1952) has formalized this superiority of simple majority vote by an axiomatic approach: if there are two candidates, it is the only voting system that has the following properties.

- 1. It is anonymous, that is to say, it treats all voters equally.
- 2. It is *neutral*, that is to say, it treats both candidates equally.
- 3. It is *positively responsive*, that is to say, if a voter prefers candidate a to candidate b, there exists no case where it is a better strategy for her to vote for b.
- 4. Implicitly, May assumes that the voting system is *ordinal*. This word meands that a voter can establish a order of preference over the candidates: either she prefers candidate a to b, or the opposite, or she likes them equally. But she cannot express a more nuanced opinion: it is thus impossible for her to express herserlf differently depending on the fact that she prefers a to b strongly or slightly.

The two first assumptions, anonymity and neutrality, seem obvious in practice, at least in the application contexts in which voters on the one hand, and the candidates, on the other hand, are assumed equal. It is not always so, and sometimes it is arguable, as in a meeting of shareholders or a federation of states of varying sizes. However, there is a wide field of application where these assumptions are simply common sense.

The third assumption, positive responsiveness, also appears to arise from common sense. It involves, in particular, that for any voter, whatever her opinions, she can emit a ballot that will defend them best, whatever the ballots of other voters: in the terminology of game theory, we say that she always has a *dominant* strategy. We will return to this concept because it is deeply linked to the manipulability, which will be the central issue of this study.

The fourth assumption, which is almost implicit in the formulation of May, is ordinality. It seems fairly intuitive, also for strategic considerations: imagine that a voter can strengthen her vote for a by affirming that she strongly prefers a to b. If it slightly prefers a to b, she might state that she strongly prefers her, simply to give better chances to his opinion to prevail. Using such a system, it may result in two situations.

• If all voters think this way, we reach a situation where the ballots proclaiming a slight preference are no longer used at all, and it is reduced to an ordinal system where the ballot "I prefer strongly" is simply used to mean "I prefer".

• Alternatively, if some voters but not all reason this way, the situation is even worse, since the first, who vote strategically, have more power than the latter, who vote naively; such a situation undermines *de facto* the principle of equality between voters.

It is also possible to justify ordinality by other very deep arguments. We will come back to this point.

Paradoxes of social choice

We have seen that when there are two candidates, we have a voting system, the simple majority vote, which has satisfactory properties, and that this voting system is unique under fairly reasonable assumptions. But when there are three candidates, things go wrong.

Condorcet's paradox

The question is: since we have a system with good properties for two candidates and that it is unique in some way, how to extend it satisfactorily in cases where there are more candidates?

To answer this question, a natural idea is to require the *independence of ir*relevant alternatives (IIA), which intuitively means that the presence or absence of losing candidates does not influence the election results. More specifically, this principle can be formulated in two equivalent ways.

- 1. If you remove a losing candidate and the election is carried again (with the same voters having the same opinions), then the winner should not change.
- 2. If you add a candidate and the election is carried again (with the same voters having the same opinions), then the new winner must be the same as in the initial election, or the candidate added.

Again, this principle seems full of common sense. If the community of voters believe candidate a is the best option among a, b and c, then it seems clear that when removing the irrelevant alternative c, the community should estimate that a is the best option if we must choose between a and b.

To illustrate this principle, we often use the following joke. In a restaurant, the server informs the customer that she can choose between chicken and beef. The customer then orders the chicken. A few minutes later, the server returns: "By the way, I forgot to tell you that there is also fish". And the customer replies: "Right, then I will take the beef". Here the customer seems to prefer the beef when the three options are available, but the chicken when only beef and chicken are offered, violating the assumption of IIA.

This joke can both show the relatively natural appearance of assuming IIA and give an opportunity to discuss its exact meaning. In this particular case, we could, for example, imagine that the customer has simply changed his mind during the five minutes of absence from the server, regardless of the addition of fish on the menu. In this case, the change of decision does not seem absurd. But IIA is about a more restricted and natural case: it simply demands that if voters retain the same opinions, the absence or presence of a non-selected candidate does not influence the result.

One could also imagine that the presence of fish on the menu informs the customer that this is a top restaurant and that, in this case, she prefers beef. With this interpretation, the customer's opinion does not vary over time, these are

the options considered that are changing: initially, she thinks she has the choice between "chicken in any restaurant" and "beef in any restaurant"; but in the second time, she thinks she has the choice between "chicken in a top restaurant", "beef in a top restaurant" and "fish in a top restaurant". So there is nothing contradictory in her change of decision and it violates only in appearance the principle of IIA.

The customer's behavior could also be motivated by various other explanations, involving, for example, non-transitive preferences. We will see another possible interpretation of this thought experiment in example 1.8. That said, IIA still seems a desirable property in general, which ensures consistency in the choices made.

To extend the simple majority vote, while respecting the principle of IIA, it is necessary to elect a candidate w which, compared to any other candidate c, is preferred by a majority of voters. Indeed, if we remove all other irrelevant candidates, then by principle of IIA, it is necessary that w wins simple majority vote against c. When a candidate satisfies this condition, she is said to be a $Condorcet\ winner$.

Ramon Llull, Majorcan scholar from the XIIIth century, seems to have been the first to describe voting systems that have the property to elect the Condorcet winner, as analyzed especially by McLean (1990), basing on the original writings by Llull (c. 1285, 1299). But, to our knowledge, this is Nicolas of Condorcet (1785) who first appears to have explicitly formulated this guiding principle and especially have noticed that there is not always such a candidate. Indeed, consider three voters with the following preferences.

$$egin{array}{c|ccc} a & b & c \\ b & c & a \\ c & a & b \\ \hline \end{array}$$

In the notation above, each column represents a voter. For example, the first voter prefers candidate a to candidate b, which she prefers to candidate c. With the preferences above, a majority of voters prefer a to b; a majority (that is not composed of the same voters) prefers to b to c and a majority prefers c to a. There is no Condorcet winner: it is called a $Condorcet\ paradox$. This phenomenon has such importance in social choice that is sometimes called simply the $Voting\ paradox$.

In particular, the above example shows that it is impossible to extend the simple majority vote, while respecting the principle of IIA (which was neither named nor as explicitly stated in Condorcet's time). For example, if it is decided that a is the winner, then that is not consistent with the outcome of an election that would be held between a and c, since the candidate c would win this electoral duel. Similarly, no candidate is a consistent winner with simple majority vote and the principle of IIA.

Arrow's Theorem

Arrow (1950) has somehow generalized the observation of Condorcet. Even if his original theorem covers social welfare functions, which allow to completely classify the proposed options to the agents, it has an immediate transcription for voting systems, which merely designate an option based on the preferences of the community 4 .

⁴We will not use the term *social choice function* because it is usually reserved for systems that are ordinals. As we develop in section 1.4, we use the term *voting system* in a broader sense, which includes non-ordinal systems.

Being relatively modest in our demands, we may ask that a voting system has the following properties.

- 1. It meets IIA.
- 2. It is *unanimous*: if all voters prefer candidate a, the she must be elected.
- 3. It it not *dictatorial*: there is not a voter who has the power to decide the outcome on her own.
- 4. Implicitly, Arrow assumes that the voting system is ordinal.
- 5. Explicitly, Arrow assumes that the voting system is *universal*, in that it identifies a winning candidate for any combination of authorized ballots. In this memoir, we will always make this assumption implicitly.

Thus, we ask the same question as before: how to get a voting system that meets IIA? But assuming that the voting system is reduced to simple majority vote when there are two candidates, one makes assumptions $a\ priori$ less demanding⁵ that it is unanimous, not dictatorial and ordinal.

Yet even with these lower requirements, Arrow's theorem tells us that there is no voting system that satisfies them (for a number of candidates greater than or equal to 3)⁶.

Regarding unanimity and non-dictatorship, these assumptions seem very difficult to give up. For ordinality, we will come back to it. Remains the property of IIA, which seems to have to be sacrificed to preserve other assumptions. In practice, all common ordinal voting systems actually violate the same assumption: IIA⁷.

It is important not to reduce Arrow's theorem to a simple procedural issue, excluding the existence of a voting system perfectly satisfactory in practice. The deepest consequence is that in an ordinal approach, there is no canonical notion of "candidate preferred by the people" if we emit the understandable wish that this notion has natural properties.

Interpersonal comparison of utilities

To solve the problems above, it would seem that removing the assumption of ordinality is a good angle of attack. A simple way to model the intensity of preferences of a voter is to use cardinal utilities: the interest of each voter for each candidate is represented by a real number. The term *cardinal* here means not only that the comparison between two utilities (which is higher) reveals which candidate is preferred by the voter but also that the numerical value of utilities reflect an intensity of preference.

Several variants of this model exist, but the most common is the one by Von Neumann and Morgenstern (1944). In this model, the utilities of a voter are defined up to an additive constant and a strictly positive multiplicative constant. Intuitively, if we make the analogy between the measurement of the position of a candidate on the abstract axis of a voter's preferences (that is to say, the axis of utilities) and measuring the position of a concrete object on a line, the voter

 $^{^{5}}$ The assumptions listed are *a priori* less demanding because IIA was assumed. This is not the case otherwise.

⁶See especially Geanakoplos (2005) for elegant proofs of Arrow's theorem, which have also inspired several variants of the proof of Gibbard-Satterthwaite theorem, which we will discuss in a moment. By the way, Mossel (2012) and Keller (2012) provide "quantitative" versions of Arrow's theorem that discuss how likely a violation of the required properties is observed.

⁷For a discussion of the assumptions of Arrow's theorem, see Gibbard (2014).

can arbitrarily choose where she places the origin of the frame (hence the additive constant) and what length unit she uses (hence the multiplicative constant).

In the case of a length measurement, an agent can lend his ruler to another, which enables at least to use the same unit. But in the case of preferences, the measurement instrument remains in the mental universe of each agent, and it is impossible to know if one uses the same length unit as another. The question does not even make sense, since it is impossible to place the preference axes of two agents in the same mental universe in order to compare the measured distances.

More generally, achieving an interpersonal comparison of utilities, that is to say intensities of preferences between agents, is impossible without adding a arbitrary additional hypothesis that *ultimately*, is to promote this or that type of agent. We will not further develop these complex questions; for a good overview, the reader is invited to consult Hammond (1991)⁸.

We will retain, in any case, that getting rid of the ordinality assumption is far from being as harmless as it seems. Furthermore, we will see other reasons to favor ordinal voting systems in the rest of the memoir 9 .

Gibbard-Satterthwaite theorem

From our point of view, the main conclusion of Arrow's theorem and of the fundamental problems of an interpersonal comparison of utilities is that there is no canonical and indisputable notion of "candidate preferred by the people". We can ask the question from another point of view: in practice, how does the voting system behave? In particular, does it give the same power to all voters depending on their level of information? From a perspective of game theory, is it easy to reach equilibrium situations?

More precisely, we say that a voting system is *manipulable* in some configuration of voter preferences if, and only if, a subset of voters, by voting not sincerely, can get elected a candidate they like better than the result of sincere vote (assuming other voters still vote sincerely). It seems intuitively obvious that manipulability is a negative property and we will soon discuss in more details why.

Unfortunately, Gibbard (1973) showed that whenever there are 3 or more eligible candidates, for any non-dictatorial voting system, there is at least one configuration where the voting system is not only manipulable, but by a coalition consisting of one single voter!

We will comply with the tradition of naming this result: Gibbard-Satterthwaite theorem. However, the result by Gibbard is both earlier and stronger than that by Satterthwaite (1975): in fact, it applies to any type of electoral system (or *game form*, see 1.4), while that of Satterthwaite only applies to ordinal voting methods.

Non-deterministic Gibbard's theorem

If we accept completely the principle of an appeal to chance, then there are satisfactory systems, unlike in the deterministic case where we saw that the road is paved with impossibility theorems.

⁸Chichilnisky (1985) also proves, by other arguments, that it is essentially impossible to aggregate cardinal preferences by a method possessing reasonable properties.

⁹One may in particular consult the theoretical results from chapter 5, simulations from chapter 7 and 8 and experiments from chapter 9.

First, we can use randomness unconditionally, without taking into account the preferences of voters. Again, there are examples in ancient Athenian democracy, where many offices were allocated by lottery from a pool of eligible candidates.

Second, we can combine voters' preferences and chance. In this case, it is natural to require that the voting system is not manipulable, unanimous and anonymous. Gibbard (1977, 1978) showed, first for ordinal voting systems then in general, that the only voting system that verifies these assumptions is *random dictatorship*: each voter votes for a candidate, then a random ballot is chosen in an equiprobable way and the candidate indicated in the bulletin is declared the winner¹⁰.

For some applications, this system may be interesting. In particular, if it is a collective decision entailing modest consequences and/or to be renewed frequently, for example the choice of a restaurant by a group of friends, then it allows a balance of power while eliminating the issue of strategic voting.

However, in other contexts, such use of chance will always be debated, except as a supplementary rule to break ties between candidates in case of perfect equality in the ballots of voters. In this memoir, we will focus exclusively on *deterministic* voting systems, that is to say that the winning candidate only depends on the ballots of voters, without using an element of randomness.

Manipulation is good. Manipulability is bad.

We quickly said that manipulability was a bad property of a voting system. We will now discuss this fundamental question.

What we call manipulation is the practice by some voters to vote strategically. It seems important to distinguish the manipulability, which is the fact that the manipulation works, that is to say, lead to a different result from the sincere vote. In other words, the manipulability of a voting system in a certain configuration of voter preferences is the fact that sincere voting is not a strong Nash equilibrium (SNE): a coalition of voters may deviate from sincere voting and get a result they deem best to the winner resulting from sincere voting.

Defense of manipulation

Manipulation, that is to say the practice of strategic voting, is sometimes seen with suspicion. Here are the main arguments of this point of view, which we will discuss.

- 1. Manipulators are cheaters.
- 2. Manipulation leads to an "incorrect" result for the election.
- 3. Manipulation is exercised at the expense of the community.

Argument 1 is arguable if we attach a moral dimension to the sincere vote, but it is opposed to all modern views on *mechanism design* and *Nash-implementability*¹¹. In general, it is considered today that agents are strategic and that the problem is to find a set of rules that will lead to a satisfactory outcome for the social well-being, accepting — and most of the time, exploiting — this strategic behavior. In economics, such a perspective essentially

¹⁰More generally, Gibbard (1978) shows, when allowing non-deterministic voting systems, what are all non-manipulable systems. The anonymous and unanimous case we cite to simplify is only a corollary of this general result.

¹¹See e.g. Feldman (1980).

dates back to the "invisible hand" by Adam Smith, and this idea can be naturally transposed into voting theory: from our perspective, the strategist voter is not a cheater but an agent that helps to find and perhaps to get a Nash equilibrium.

Regarding argument 2, one can oppose to it Arrow's theorem (in an ordinal framework) and the fundamental problems of interpersonal comparison of utilities (in a cardinal framework): there is no canonical notion of "candidate preferred by the people". Talking about "incorrect result" therefore does not really make sense.

Argument 3 has similarities with the previous one. But while argument 2 implies the existence of some sort of higher truth ("correct result", given the sincere preferences of the population), argument 3 is more pragmatic and eventually comes back to the question: what voters prefer the winner of the sincere election, and which ones prefer the winner resulting from manipulation?

In the general case, it is clearly possible that some voters are less satisfied with the alternative than with the sincere winner. But this can not be the case for all voters: in fact, at least the manipulators prefer the alternate winner by definition. However, we will see that the opposite can happen: it is possible that all voters prefer the alternative winner to the sincere winner (that is to say that the first *Pareto-dominates* the second).

Indeed, consider the following example. It has 26 candidates, designated by the letters of the alphabet. We use the voting system Veto, with the alphabetical tie-breaking rule.

- 1. Each voter emits a veto¹², i.e. votes against one candidate.
- 2. The candidate receiving the least number of vetoes is elected.
- 3. In case of a tie, the first tied candidate in alphabetical order is declared the winner.

Suppose there are 25 voters and they unanimously prefer candidates in alphabetical reverse order (they prefer z and hate a). If they vote sincerely, they all emit a veto against a, by tie-breaking rule, b is elected: this is the second worst candidate for all voters!

If a voter is aware of this fact, she may decide to vote strategically against b and c is then to be elected, improving the fate of the entire community. This manipulation is not harmful. We can even go further: if voters skillfully coordinate to vote against all candidates except z, then this one is elected, which best satisfies all voters.

To summarize, it is possible that manipulation is exercised for the benefit of the whole community. Conversely, even if it is possible it occurs at the expense of a part of the community, it can not affect the whole community. So, argument 3 is quite circumstantial and questionable in general.

Manipulability and strong Nash equilibria (SNE)

Let us continue with a more practical example, since it now belongs to History. The French presidential election in 2002 was conducted using the two-round system. In the first round, Jacques Chirac (right) received 19.9% of the votes, Jean-Marie Le Pen (extreme right) 16.9%, Lionel Jospin (left) 16.2% and 13 various candidates shared the rest. In the second round, Chirac was the winner by 82.2% of the votes against Le Pen.

 $^{^{12}}$ In this memoir, we call veto, with a lowercase, a negative vote against a candidate. The word Veto, with a capital letter, means the voting system described above, also known as Antiplurality.

However, according to some of the polls from these days, Jospin would have won the second round against any opponent, that is to say, he was the Condorcet winner. It is impossible to verify whether this was the case throughout the French electorate; but it helps to know that the reality was close enough to this case so that we can consider as a realistic example a situation where the observed votes were sincere and where Jospin was Condorcet winner.

Under this assumption, there was a possibility of manipulation: if all voters preferring Jospin to Chirac voted for Jospin in the first round, then Jospin would have directly been elected in the first round. In other words, sincere vote was not a strong Nash equilibrium (SNE). But voters have not achieved this manipulation, and that is a key observation which we will discuss.

This mainly poses two kinds of problems:

- 1. The feeling of voters a posteriori;
- 2. The legitimacy of the result.

On one hand, after the election, some sincere voters may experience regret about the choice of their ballots and also a feeling of injustice: since insincere ballots would have better defended their opinions, they may feel that their sincere bulletins have not had the impact they deserved. They can draw from this a distrust of the voting system used itself: the fast that a sincere bulletin does not defend best the views it expresses appears as a bug of the system¹³. This experience can even develop or reinforce their distrust of elective practice in general.

On the other hand, there is concern for the result of such an election. On this aspect, this example can receive two interpretations, but they both lead to condemn the manipulability. If it is estimated that the result of sincere voting, by definition, represents best the views of the voters, then Chirac was the legitimate winner; but in this case, the manipulability of the situation might have lead to the election of Jospin if the voters concerned had been more skillful. At the opposite, if it is considered that a manipulable result is better in terms of social welfare (as in this case would defend the supporters of the Condorcet criterion), then the manipulation itself is not undesirable but the manipulability of the situation is so all the same: indeed, it makes this "better" outcome harder to identify and produce. For example, if the entire voting population votes sincerely, it is not reached.

So it seems that in this case there was a difference between the observed result of the election and that of a possible SNE. It is amusing to note that, in other contexts of game theory, it may happen to study the SNE because we think that these are the configurations to which the agents will naturally converge. In voting theory, we think that the situation is slightly different: these are situations to which it would be desirable to converge for the reasons given above; but in practice, this can be difficult to achieve because the sincere vote does not necessarily lead to an SNE. This problem is precisely the definition of manipulability.

Like any real example, the French presidential election of 2002 should be examined more carefully than an artificial example, which can be adjusted at will to illustrate an argument paradigmatically. In particular, it is necessary here to distinguish the fact that the situation is not an SNE from the fact that the winner is not the Condorcet winner (although the two aspects are connected). The first

¹³Forgive me a personal anecdote: when I became interested in the theory of voting, after this famous April 21st, 2002, I had withdrawn from the election the firm belief that the two-round system was a catastrophic one in terms of manipulability. However, we will see in the chapters 7, 8 and 9 that, even if it is not the least manipulable voting system in general, it is far from being the worst, even for fifteen candidates.

can cause a variety of problems, which we have described; the second can also be a problem of legitimacy of the winner, since a majority of voters prefer the Condorcet winner to the candidate elected. Fortunately, we will see (especially in chapter 2) that acting against these two problems is not incompatible, quite the contrary.

By the way, the situation we have described also had an important symbolic dimension, linked to the practical running of the two-round system and its analogy in principle with some sports competitions. Thus, it seemed shocking to some voters that a candidate of the extreme right reaches the "final" of the competition and appears in some way as second in the final "ranking". However, we will not develop this point beyond measure: while keeping in mind that the symbolic dimension and the public perception of events is always important, especially for a political election, we will consider in this memoir that the main result of an election is the choice of the winning candidate.

Manipulability and straightforwardness

By definition, the manipulability of a voting system means that the situation of sincere voting is not necessarily an SNE. This poses several problems.

- 1. Before the election, the voter faces a dilemma: to vote sincerely or strategically? If she attributes a moral virtue to sincere voting, it can be a matter of conscience. Otherwise, there still remains a practical problem: how to choose a strategic voting that is best adapted to the situation?
- 2. These strategic aspects induce de facto asymmetry of power between informed and strategist voters and those who are neither one nor the other. As Dodgson said in a phrase made famous by Black (1958), the vote becomes "more of a game of skill than a real test of the wishes of the electors".
- 3. As seen in the example of Veto, if the situation is manipulable, then voters may need information, computing power and coordination to achieve a SNE (even in a situation that is *a priori* favorable, where they all agree). In contrast, if the situation is not manipulable, voting sincerely simply achieves such an equilibrium; no exchange of information, no calculations and no coordination is therefore necessary.
- 4. This individual or collective need for information gives a questionable power to the sources of information, such as the media and pollsters.

We will show that these problems are deeply related to an issue intimately connected to the manipulability, the *straightforwardness*. It is said that a voting system is *straightforward* (Gibbard, 1973) if any voter, whatever her opinions, has a dominant strategy. To understand the distinction between this concept and non-manipulability, consider the simple case where there are only two candidates and examine the three following voting methods. The last two are rather theoretical curiosities, but they will allow us to illustrate our point of view.

Simple majority vote Each voter is supposed to announce her preferred candidate, a or b, and the candidate receiving the most votes is elected.

Inversed majority vote Each voter is supposed to announce her preferred candidate, *a* or *b*, but the vote is counted in favor of the other candidate.

Parity voting Each elector put a white ball or a black ball in the ballot box. If there are an odd number of black balls, then a is elected. Otherwise, b is elected.

Simple majority vote is not manipulable. In particular, as we have already noticed, each voter always has a dominant strategy (which is simply the sincere vote). In other words, this voting system is *straightforward*.

As for the inversed majority vote, it is generally manipulable: indeed, if a voter prefers a, she has an interest in abandoning a ballot with label a and preferring a ballot with label b, since it will be counted for a. However, this voting system is straightforward: a voter who prefers a is always better using a ballot b and vice versa. Although this voting system can cause some confusion, it does not pose the other problems mentioned: it is easy to find SNE without calculation, without exchange of information and without particular coordination. Therefore, these problems are linked to defects in straightforwardness and not to manipulability. Moreover, we see in this example that the notion of sincere voting is partly conventional: we could have, instead, interpret the ballot with label a as a veto against a. With this convention of language, we would have found that this method of voting is never manipulable.

Now consider parity voting. If a voter knows the ballots of other voters, then she can always decide the winning candidate. Most often, this method of voting is manipulable. And it is especially not *straightforward*: if a voter prefers a, she has essentially no indication of whether a white or black ball best defends her opinion. In this voting method, all the problems mentioned above are exacerbated: for example, even if all voters prefer the same candidate, they need perfect coordination to elect her. Moreover, the balance of power between voters is particularly destroyed: a voter having perfect information has absolute power, while an ignorant voter has essentially no power of decision.

To summarize: we examined a non-manipulable voting system (which is thus straightforward), a voting system that is straightforward but manipulable, and a voting system that is not straightforward (and thus manipulable). And we found that the problems mentioned are actually more related to a defect in straightforwardness than to manipulability, because these problems are absent from the second voting system that we have examined.

However, there is a deep connection between manipulability and straightforwardness. Indeed, up to conventionally define sincere voting as the use of the dominant strategy (as we did by transforming the inversed majority vote into Veto), a straightforward voting system is not manipulable. Conversely, if a voting system is not straightforward, then there is no way to define sincere voting that makes it non-manipulable.

In summary, by a suitable choice of the *sincerity function*, that is to say, the conventional way one associates a vote deemed sincere to an opinion, the issue of straightforwardness, which the fundamental point, can therefore be reduced to the question of manipulability, more comfortable to handle in practice.

Manipulability indicators

Gibbard's theorem teaches us that no non-trivial voting system¹⁴, whether ordinal or cardinal, can be straightforward. In other words, irrespective of the sincerity function used, a non-trivial voting system is necessarily manipulable.

All we can hope is therefore to limit the scope of the problem, studying to what extend classic voting systems are manipulable and identifying methods for designing less manipulable voting systems.

¹⁴Here, we use the language shortcut *non-trivial* to mean: not reduced to two eligible candidates and not dictatorial.

To this end, our reference indicator will be the manipulability rate of a voting system: depending on the *culture*, that is to say, the probability distribution of preferences of the population, this rate is defined as the likelihood that the voting system is manipulable in a randomly drawn configuration. In other words, it is the probability that voting without any exchange of information leads to a SNE.

In the literature, there are mainly two ways to estimate the manipulability of a voting system:

- 1. The necessary number of manipulators, and other similar types of indicators quantifying the manipulability when it is possible¹⁵.
- 2. La algorithmic complexity of manipulation ¹⁶.

In both cases, it is generally estimated that the more difficult the manipulation, the more it is a desirable property of the voting system. While understanding and respecting this point of view, we find interesting and relevant to defend precisely the opposite opinion.

Indeed, we have argued that reaching easily an SNE is a good property for a voting system. For this, the best case is where the electoral system is not manipulable, since it means that we are able to reach an equilibrium without any exchange of information and any particular calculation. But in other cases, to have the best chance of achieving an equilibrium, it is better that voting strategically is inexpensive in number of voters, information, computational complexity and communication.

Think back to the example mentioned earlier of Veto. In the situation we described, to achieve an equilibrium, we need that 24 out of 25 voters vote strategically. Some may feel that this is a good thing, because this manipulation is very difficult to perform. On the contrary, we think it is a bad property, since it takes a lot of effort to achieve the only reasonable outcome!

Consider another example, approval voting. Each voter votes for as many candidates as she wishes, and the candidate receiving the most votes is declared the winner. In practice, we will see, in this memoir, that this voting method is often manipulable. However, it has at least the advantage that the strategic question is relatively simple: as explained by Laslier (2009), it is sufficient to have access to surveys giving the two favorite candidates to use an effective strategy, the *Leader rule*. In addition, the use of this strategic behavior leads to elect the Condorcet winner if she exists. Thus, even in cases where a sincere vote does not result in an equilibrium, it is possible to find one with a relatively low cost ¹⁷.

In summary, we believe that a good property is that manipulation is easy. And the ideal manipulation, since it does not require any information, is simply sincere voting.

¹⁵One can read Chamberlin et al. (1984); Saari (1990); Lepelley and Valognes (1999); Slinko (2004); Favardin and Lepelley (2006); Pritchard and Slinko (2006); Pritchard and Wilson (2007); Xia and Conitzer (2008); Lepelley et al. (2008); Reyhani et al. (2009); Reyhani (2013); Green-Armytage (2014). For several manipulability indicators connected to manipulation by a single voter, one can read in particular Aleskerov and Kurbanov (1999).

¹⁶This research area was initiated by Bartholdi et al. (1989a); Bartholdi and Orlin (1991). Since then, various results about the complexity of manipulation have been proven for several classic voting systems, which we will discuss later. Similarly, Conitzer and Sandholm (2003), Elkind and Lipmaa (2005b) and Elkind and Lipmaa (2005a) propose methods to transform a voting system so as to increase the complexity of manipulation. However, Conitzer and Sandholm (2006); Procaccia and Rosenschein (2006, 2007); Faliszewski and Procaccia (2010) show that it is essentially impossible to have a voting system that has reasonable properties and is algorithmically difficult to manipulate on average.

¹⁷One may also consult Myerson (1999).

Our main objectives

With all these considerations exposed, it is time to present the main goals that guided our research.

First, we want to quantify the manipulability. Is it common in practice? Among the voting systems, which are less manipulable? Are the differences significant?

Second, by studying the manipulability rates, we quickly observed the following problem: we do not know the minimum rate that can be achieved in a given class of voting systems¹⁸. Therefore, we can compare the voting systems between them, but we can not say whether the observed manipulability rates are far from optimum. Ideally, we would like to identify a minimum manipulability voting system, or at least estimate the corresponding manipulability rate: even if the resulting voting system was too complex to be used in practice, it would provide us with a yardstick to gauge the manipulability rate of other voting systems.

Contributions and plan

Theoretical study of manipulability

Chapter ?? develops the formalism of electoral spaces, which makes it possible to capture all types of voting systems, including cardinals systems and even other types of systems. We use the opportunity of this chapter to recall the formal definition of Condorcet notions and to present the voting systems studied in this memoir. In particular, we present the system IRV, also known as STV, which plays an important role in the following chapters. We also introduce the system IRVD, a variant of IRV that was suggested to us by Laurent Viennot. Finally, systems CSD and IB are, to our knowledge, original contributions.

In chapter 2, we show that for all classic voting methods except Veto, we can make the system less manipulable by adding a preliminary test to elect the Condorcet winner if there exists one¹⁹. We call this system the *Condorcification* of the initial voting system. We precisely discuss with what Condorcet notions this result is valid and we show that the reduction of manipulability achieved is strict for all classic voting systems except Veto, using a concept that we introduce and characterize, the *resistant Condorcet winner*.

Condorcification theorems assume that the voting system under study meets a property we call informed majority coalition criterion (InfMC), which means that a strict majority of voters always have the power to choose the outcome of the election, if they know the ballots emitted by the other voters. In practice, all classic voting systems meet this assumption, except Veto. In chapter 3, we define several other majority criteria, some of which are original contributions, and we study their link to the difficulty of finding SNE. For all classic voting methods, we study what criteria are met.

Even if a broad category of systems meet the assumption **InfMC**, this is not always the case. In chapter 4, we study how to reduce manipulability in general, through a process we call *generalized Condorcification*, using an approach based

¹⁸Whenever we mention the concept of minimal manipulability, it is in a certain class of "reasonable" voting systems, which we will define later. Indeed, if we considered all electoral systems, the question would be trivial, since the dictatorship is not manipulable at all.

¹⁹Another voting system, which is slightly less classic, is not concerned by this result, just like Veto: Kim-Roush's method, which is inspired by Veto and whose definition will be recalled. In the following, we will see that most of the theorems that do not apply to Veto does not apply to Kim-Roush's method either.

on the theory of *simple games*. For classic systems meeting **InfMC**, we use this formalism to show that Condorcification in the usual sense, that is to say based on the Condorcet winner, is, in some sense, optimal.

In chapter 5, we study the influence of the ordinal nature of the voting system on its manipulability. We show that for any non-ordinal voting system, there is an ordinal voting system that has some properties in common with the original voting system and is at most as manipulable, provided that culture meets a condition that we introduce: decomposability. In particular, we show that this theorem is applicable when voters are independent in the probabilistic sense. Combining this result with the Condorcification theorems, we conclude that the search for a voting system of minimal manipulability (within the class of systems meeting InfMC) can be restricted to voting systems that are ordinal and meet the Condorcet criterion.

Computer assisted study of manipulability

Starting from chapter 6, we temporarily put aside the search for a voting system of minimal manipulability and we try to quantify the manipulability of classic voting systems. For that purpose, we present SVAMP, a Python package of our own dedicated to the study of voting systems and their manipulation. Its software architecture is modular, allowing rapid implementation of new voting systems. Using the criteria defined in chapter 3, SVAMP has generic manipulation algorithms and specific algorithms for some voting systems, either from the literature or designed for this software package. SVAMP will be used in all the following chapters.

In chapter 7, we study the manipulability rates of different voting systems in *spheroidal* cultures, which generalize the model commonly known as *impartial* culture (see for example Nitzan, 1985). In particular, we use, for the first time, Von Mises-Fisher model to draw preferences and we explain the reasons for this choice. We study the effect of changes in various parameters and we introduce diagrams of *meta-analysis*, which compare the manipulability of all electoral systems under study. We show in particular that the voting system *CIRV*, obtained by Condorcification of IRV, is usually the least manipulable.

In chapter 8, we study another model, based on an abstract political spectrum and generalizing the notion of *single-peaked* culture introduced by Black (1958). This different framework allows us to qualify our conclusion on CIRV system: indeed, its supremacy is then more questionable than in spheroidal cultures. In particular, other voting systems have interesting performances, such as CSD, IB, the two-round system and others.

In chapter 9, we analyze real experiments, coming from very different contexts, including contexts of preference revelation that are not elections. These experiments allow us to confirm previous findings that there is frequently a Condorcet winner (e.g. Tideman, 2006) and establish that the system CIRV is distinguished by its low manipulability.

Chapter 10 resumes looking for a voting system of minimum manipulability (in the class of systems meeting **InfMC**). We define the *opportunity graph* of an electoral space and show that the issue can be reduced to a problem of integer linear programming, which can be studied for very small values of the parameters by combining a theoretical approach and the use of a dedicated software (CPLEX). Finally, SVAMP is used to compare the classic voting systems with the optimum.

Appendices

In appendix A, we study issues of measurability, that is to say, a technical point related to the use of probability spaces, mainly useful for chapter 5 about slicing.

In appendix B, we present a work done in collaboration with Benoît Kloeckner on the geometry of the utility space. This motivates our use of spheroidal cultures in chapter 7.

In appendix C, we illustrate how the study of voting systems and their manipulability can provide answers to the issues of telecommunications, using a model originally designed by Ludovic Noirie. In particular, we show that the system IRV reconciles non-manipulability and economic efficiency.

In the glossary (page 311), the reader will find a summary of the main notations and acronyms used in this memoir.

We wish you a good reading!

Part I Theoretical study of manipulability

Part II Computer-assisted study of manipulability

Appendices

Notations

$Non-alphabetical\ symbols$

$[\alpha, \beta[$	Real interval from α included to β excluded (French convention).
$[\![j,k]\!]$	Integer interval from j to k included.
$\lfloor \alpha \rfloor$	Floor function of real number α .
$\lceil \alpha \rceil$	Ceiling function of real number α .
$ \mathcal{A}(v) $	Number of voters v meeting assertion $\mathcal{A}(v)$.
$\pi(A \mid B)$	Conditional probability of event A knowing B .

Greek alphabet

μ	The law of variable P (unless otherwise stated).
π	A culture over electoral space Ω . More generally, a probability measure.
$ au_{ ext{CM}}^{\pi}(f)$	Coalitional manipulability rate of voting system f in culture π .
Ω	Set $\prod_{v \in \mathcal{V}} \Omega_v$ of possible configurations ω . Also used as a notation shortcut for an electoral space (V, C, Ω, P) .
Ω_M	Set of possible states ω_M for voters in a set M .
Ω_v	Set of possible states ω_v for voter v .

Latin alphabet

$C \in \mathbb{N} \setminus \{0\}$	Number of candidates.
\mathcal{C}	Set $[1, C]$ of indexes for the candidates.
card(E)	Cardinal of set E .
$D(\omega)$	Matrix of duels in ω . The coefficient of indexes c and d is denoted $D_{cd}(\omega)$ or, in short, D_{cd} .

$\mathcal{F}_{\mathcal{C}}$	Set of strict weak orders over \mathcal{C} .
<i>J.C.</i>	A state-based voting system (SBVS), i.e. a function $\Omega \rightarrow$
f	\mathcal{C} . In the case of a general voting system, f denotes its
J	processing function $S_1 \times \ldots \times S_V \to C$.
f^*	Condorcification of f .
$f^{\mathrm{adm}}, f^{!\mathrm{adm}}$	Condorcification variants of f based on the notion of
J , J	Condorcet-admissible candidate.
$f^{ m faible}, f^{ m !faible}$	Condorcification variants of f based on the notion of weak
	Condorcet winner.
f^{rel}	Relative Condorcification of f .
$f^{\mathcal{M}}$	\mathcal{M} -Condorcification of f .
f_y	Slice of f by a slicing method y .
$c I_v d$	Voter v is indifferent between c and d .
Id	The identity function (the context precises in which set).
$\mathcal{L}_{\mathcal{C}}$	Set of strict total orders over \mathcal{C} .
\mathcal{M}	A family of collections of coalitions.
$\mathcal{M}_c \in \mathcal{P}(\mathcal{P}(\mathcal{V}))$	A collection of coalitions that are said $winning$ for candidate c .
$\mathrm{Manip}_{\omega}(\mathrm{w} \to c)$	Set of voters preferring c to w. In short, Manip(w $\rightarrow c$).
CM_f	Set of configurations ω where f is manipulable (or indicator
	function of this set).
$\operatorname{mean}(x_1,\ldots,x_k)$	Arithmetical average of x_1, \ldots, x_k .
P	Function $\Omega \to \mathcal{R}$ that, to state ω of the population, associates profile $P(\omega) = (P_1(\omega_1), \dots, P_V(\omega_V))$.
$c P_v d$	Voter v prefers c to d .
$c P_{abs} d$	c has an absolute victory against d: $ c P_v d > \frac{V}{2}$.
$c P_{\rm rel} d$	c has a relative victory against d: $ c P_v d > d P_v c $.
$c P_{\mathcal{M}} d$	c has an \mathcal{M} -victory against d: $\{v \text{ s.t. } c P_v d\} \in \mathcal{M}_c$.
$c \operatorname{MP}_v d$	Voter v prefers c to d and vice versa (impossible if P_v is antisymmetric).
$c \operatorname{PP}_v d$	Voter v prefers c to d but not d to c (synonym of c P_v d if
	P_v is antisymmetric).
\mathcal{R}	Set $\mathcal{R}_{\mathcal{C}}^{V}$ whose an element (profile) represents binary relations of preference for the whole population of voters.
$\mathcal{R}_{\mathcal{C}}$	Set of binary relations over \mathcal{C} .
$\operatorname{Sinc}_{\omega}(\mathbf{w} \to c)$	Set of voters who do not prefer c to w. In short, $\operatorname{Sinc}(\mathbf{w} \to c)$.
$V \in \mathbb{N} \setminus \{0\}$	Number of voters.
(V, C, Ω, P)	An electoral space. In short, Ω .
\mathcal{V}	Set $[1, V]$ of indexes for the voters.
$\operatorname{vect}(E)$	Linear span of E , where E is a part of a vector space.
y	Set $\prod_{v \in \mathcal{V}} \mathcal{Y}_v$ of slicing methods y for the whole population of voters.

Acronyms and abbreviations

AV	Approval voting.
Bald.	Baldwin's method.
Bor.	Borda's method.
Buck.	Bucklin's method.
CIRV	Condorcification of IRV.
CM	Coalition manipulation / manipulable.
Cond	Condorcet criterion.
Coo.	Coombs' method.
CSD	Condorcet's method with sum of defeats.
EB	Exhaustive ballot.
IB	Iterated Bucklin's method.
ICM	Ignorant-coalition manipulation / manipulable.
iff	If and only if.
IgnMC	Ignorant majority coalition criterion.
IIA	Independence of irrelevant alternatives.
IM	Individual manipulation / manipulable.
InfMC	Informed majority coalition criterion.
IRV	Instant-runoff voting.
IRVA	Instant-runoff voting based on the average.
IRVD	Instant-runoff voting with duels.
ITR	Instant two-round system.
Kem.	Kemeny's method.
KR	Kim-Roush's method.
MajBal	Majority ballot criterion.
MajFav	Majority favorite criterion.
MajUniBal	Majority unison ballot criterion.
Max.	Maximin.
MJ	Majority Judgement.
Nan.	Nanson's methodd.
Plu.	Plurality.
RP	Ranked Pairs method.
RV	Range voting.
s.t.	Such that.
SBVS	State-based voting system.

Sch.	Schulze's method.
SWAMP	Simulator of Various Voting Algorithms in Manipulating Populations.
TM	Trivial manipulation / manipulable.
TR	Two-round system.
UM	Unison manipulation / manipulable.
VMF	Von Mises–Fisher.

Bibliography

- Fuad Aleskerov and Eldeniz Kurbanov. Degree of manipulability of social choice procedures. In Society for the Advancement of Economic Theory, editor, *Current trends in economics: theory and applications*, Studies in economic theory, pages 13–27. Springer, 1999.
- Fuad Aleskerov, Daniel Karabekyan, Remzi Sanver, and Vyacheslav Yakuba. Computing the degree of manipulability in the case of multiple choice. *Computational Social Choice (COMSOC-2008)*, page 27, 2008.
- Kenneth Arrow. A difficulty in the concept of social welfare. The Journal of Political Economy, 58(4):328–346, 1950.
- Navin Aswal, Shurojit Chatterji, and Arunava Sen. Dictatorial domains. *Economic Theory*, 22(1):45–62, 2003.
- Michèle Audin. Geometry. Universitext (Berlin. Print). Springer Berlin Heidelberg, 2003.
- Haris Aziz, Serge Gaspers, Nicholas Mattei, Nina Narodytska, and Toby Walsh. Ties matter: Complexity of manipulation when tie-breaking with a random vote. In AAAI, 2013.
- Michel Balinski and Rida Laraki. Majority Judgment: Measuring, Ranking, and Electing. MIT Press, 2010.
- Salvador Barberá. Strategy-proofness and pivotal voters: A direct proof of the Gibbard-Satterthwaite theorem. *International Economic Review*, 24(2):413–417, 1983.
- Salvador Barberà. An introduction to strategy-proof social choice functions. *Social Choice and Welfare*, 18:619–653, 2001.
- Salvador Barberá and Bezalel Peleg. Strategy-proof voting schemes with continuous preferences. *Social Choice and Welfare*, 7:31–38, 1990.
- John Bartholdi and James Orlin. Single transferable vote resists strategic voting. Social Choice and Welfare, 8:341–354, 1991.
- John Bartholdi, Craig Tovey, and Michael Trick. The computational difficulty of manipulating an election. *Social Choice and Welfare*, 6:227–241, 1989a.
- John Bartholdi, Craig Tovey, and Michael Trick. Voting schemes for which it can be difficult to tell who won the election. *Social Choice and welfare*, 6(2): 157–165, 1989b.

- Eugenio Beltrami. Résolution du problème de reporter les points d'une surface sur un plan, de manière que les lignes géodésiques soient représentée par des lignes droites. *Annali di Matematica*, 1866.
- Eugenio Beltrami. Essai d'interprétation de la géométrie noneuclidéenne. Trad. par J. Hoüel. Ann. Sci. École Norm. Sup., 6:251–288, 1869.
- Jean-Pierre Benoît. The Gibbard-Satterthwaite theorem: a simple proof. *Economics Letters*, 69(3):319–322, 2000.
- Douglas Bernheim, Bezalel Peleg, and Michael Whinston. Coalition-proof Nash equilibria I. Concepts. *Journal of Economic Theory*, 42(1):1–12, 1987.
- Nadja Betzler, Jiong Guo, and Rolf Niedermeier. Parameterized computational complexity of Dodgson and Young elections. *Information and Computation*, 208(2):165–177, 2010.
- Nadja Betzler, Rolf Niedermeier, and Gerhard Woeginger. Unweighted coalitional manipulation under the Borda rule is NP-hard. In *Proceedings of the 22th International Joint Conference on Artificial Intelligence (IJCAI '11)*, 2011.
- Duncan Black. The theory of committees and elections. University Press, 1958.
- Jean-Marie Blin and Mark Satterthwaite. Strategy-proofness and single-peakedness. *Public Choice*, 26:51–58, 1976.
- Kim Border and J.S. Jordan. Straightforward elections, unanimity and phantom voters. *The Review of Economic Studies*, 50(1):153–170, 1983.
- Steven Brams. Voting procedures. In R.J. Aumann and S. Hart, editors, *Handbook of Game Theory with Economic Applications*, volume 2 of *Handbook of Game Theory with Economic Applications*, chapter 30, pages 1055–1089. Elsevier, 1994.
- Steven Brams. Approval voting. In C.K. Rowley and F. Schneider, editors, *The Encyclopedia of Public Choice*, pages 344–346. Springer US, 2003.
- Steven Brams and Peter Fishburn. Approval voting. American Political Science Review, 72:831–847, 1978.
- Felix Brandt and Markus Brill. Necessary and sufficient conditions for the strategyproofness of irresolute social choice functions. In *Proceedings of the 13th Conference on Theoretical Aspects of Rationality and Knowledge*, pages 136–142. ACM, 2011.
- Markus Brill and Vincent Conitzer. Strategic voting and strategic candidacy. In *Proceedings of the Twenty-Ninth AAAI Conference on Artificial Intelligence*, Austin, USA, 2015.
- Markus Brill and Felix Fischer. The price of neutrality for the ranked pairs method. COMSOC 2012, page 95, 2012.
- Colin Campbell and Gordon Tullock. A measure of the importance of cyclical majorities. *The Economic Journal*, 75(300):853–857, 1965.
- Ioannis Caragiannis, Jason Covey, Michal Feldman, Christopher Homan, Christos Kaklamanis, Nikos Karanikolas, Ariel Procaccia, and Jeffrey Rosenschein. On the approximability of Dodgson and Young elections. In *Proceedings of the twentieth Annual ACM-SIAM Symposium on Discrete Algorithms*, pages 1058–1067. Society for Industrial and Applied Mathematics, 2009.

- John Chamberlin, Jerry Cohen, and Clyde Coombs. Social choice observed: Five presidential elections of the american psychological association. The Journal of Politics, 46:479–502, 1984.
- Graciela Chichilnisky. Von Neumann-Morgenstern utilities and cardinal preferences. *Mathematics of Operations Research*, 10(4):633–641, 1985.
- Tom Coleman and Vanessa Teague. On the complexity of manipulating elections. In Joachim Gudmundsson and Barry Jay, editors, *Thirteenth Computing: The Australasian Theory Symposium (CATS2007)*, volume 65 of *CRPIT*, pages 25–33. ACS, 2007.
- Marie Jean Antoine Nicolas de Caritat, marquis de Condorcet. Essai sur l'application de l'analyse à la probabilité des décisions rendues à la pluralité des voix. Imprimerie royale, 1785.
- Vincent Conitzer and Tuomas Sandholm. Complexity of manipulating elections with few candidates. In *Eighteenth national conference on Artificial intelligence*, pages 314–319. American Association for Artificial Intelligence, 2002.
- Vincent Conitzer and Tuomas Sandholm. Universal voting protocol tweaks to make manipulation hard. In *Proceedings of the 18th international joint conference on Artificial intelligence*, pages 781–788. Morgan Kaufmann Publishers Inc., 2003.
- Vincent Conitzer and Tuomas Sandholm. Nonexistence of voting rules that are usually hard to manipulate. In *Proceedings of the 21st national conference on Artificial intelligence Volume 1*, pages 627–634. AAAI Press, 2006.
- Vincent Conitzer, Jérôme Lang, and Tuomas Sandholm. How many candidates are needed to make elections hard to manipulate? In *Proceedings of the 9th conference on Theoretical aspects of rationality and knowledge*, pages 201–214. ACM, 2003.
- Vincent Conitzer, Tuomas Sandholm, and Jérôme Lang. When are elections with few candidates hard to manipulate? *J. ACM*, 54, June 2007.
- Jessica Davies, George Katsirelos, Nina Narodytska, and Toby Walsh. Complexity of and algorithms for Borda manipulation. AAAI, 11:657–662, August 2011.
- Jessica Davies, George Katsirelos, Nina Narodytska, Toby Walsh, and Lirong Xia. Complexity of and algorithms for the manipulation of Borda, Nanson's and Baldwin's voting rules. *Artificial Intelligence*, 217:20–42, 2014.
- Frank DeMeyer and Charles Plott. The probability of a cyclical majority. *Econometrica*, 38(2):345–354, 1970.
- Amogh Dhamdhere and Constantine Dovrolis. The Internet is flat: modeling the transition from a transit hierarchy to a peering mesh. In *Proceedings of the 6th International Conference*, Co-NEXT '10, page 21. ACM, 2010.
- Thomas Downs. Some relationships among the Von Mises distributions of different dimensions. Biometrika, 53(1/2):269-272, 1966.
- John Duggan and Thomas Schwartz. Strategic manipulability without resoluteness or shared beliefs: Gibbard-Satterthwaite generalized. *Social Choice and Welfare*, 17:85–93, 2000.

- François Durand, Fabien Mathieu, and Ludovic Noirie. Manipulability of voting systems. Groupe de travail Displexity, http://www.liafa.univ-paris-diderot.fr/~displexity/docpub/6mois/votes.pdf, 2012.
- François Durand, Fabien Mathieu, and Ludovic Noirie. On the manipulability of voting systems: application to multi-operator networks. In *Proceedings of the 9th International Conference on Network and Service Management (CNSM)*, pages 292–297. IEEE, 2013.
- François Durand, Fabien Mathieu, and Ludovic Noirie. Élection du best paper AlgoTel 2012: étude de la manipulabilité. In AlgoTel 2014 16èmes Rencontres Francophones sur les Aspects Algorithmiques des Télécommunications, 2014a.
- François Durand, Fabien Mathieu, and Ludovic Noirie. Making most voting systems meet the Condorcet criterion reduces their manipulability. https://hal.inria.fr/hal-01009134, 2014b.
- François Durand, Fabien Mathieu, and Ludovic Noirie. Élection d'un chemin dans un réseau: étude de la manipulabilité. In AlgoTel 2014 16èmes Rencontres Francophones sur les Aspects Algorithmiques des Télécommunications, 2014c.
- François Durand, Fabien Mathieu, and Ludovic Noirie. Reducing manipulability. Poster présenté au 5th International Workshop on Computational Social Choice (COMSOC), 2014d.
- François Durand, Fabien Mathieu, and Ludovic Noirie. Making a voting system depend only on orders of preference reduces its manipulability rate. https://hal.inria.fr/hal-01009136, 2014e.
- François Durand, Benoît Kloeckner, Fabien Mathieu, and Ludovic Noirie. Geometry on the utility sphere. In *Proceedings of the 4th International Conference on Algorithmic Decision Theory (ADT)*, 2015.
- Bhaskar Dutta, Matthew Jackson, and Michel Le Breton. Strategic candidacy and voting procedures. *Econometrica*, 69(4):1013–1037, 2001.
- Bhaskar Dutta, Matthew Jackson, and Michel Le Breton. Voting by successive elimination and strategic candidacy. *Journal of Economic Theory*, 103(1):190–218, 2002.
- Lars Ehlers, Hans Peters, and Ton Storcken. Threshold strategy-proofness: on manipulability in large voting problems. *Games and Economic Behavior*, 49 (1):103–116, 2004.
- Edith Elkind and Helger Lipmaa. Small coalitions cannot manipulate voting. In Andrew Patrick and Moti Yung, editors, Financial Cryptography and Data Security, volume 3570 of Lecture Notes in Computer Science, pages 578–578. Springer Berlin / Heidelberg, 2005a.
- Edith Elkind and Helger Lipmaa. Hybrid voting protocols and hardness of manipulation. In Xiaotie Deng and Ding-Zhu Du, editors, *Algorithms and Computation*, volume 3827 of *Lecture Notes in Computer Science*, pages 206–215. Springer Berlin / Heidelberg, 2005b.
- Piotr Faliszewski and Ariel Procaccia. AI's war on manipulation: Are we winning? *AI Magazine*, 31(4):53–64, 2010.

- Pierre Favardin and Dominique Lepelley. Some further results on the manipulability of social choice rules. *Social Choice and Welfare*, 26:485–509, 2006.
- Pierre Favardin, Dominique Lepelley, and Jérôme Serais. Borda rule, Copeland method and strategic manipulation. *Review of Economic Design*, 7:213–228, 2002.
- Allan Feldman. Welfare economics and social choice theory. Kluwer Nijhoff Publishing. Martinus Nijhoff Pub., 1980.
- Peter Fishburn. Utility Theory for Decision Making. Wiley, New York, 1970.
- Peter Fishburn. Nonlinear preference and utility theory. Johns Hopkins series in the mathematical sciences. Johns Hopkins University Press, 1988.
- Peter Fishburn and Steven Brams. Efficacy, power and equity under approval voting. *Public Choice*, 37(3):425–434, 1981.
- Peter Fishburn and William Gehrlein. Borda's rule, positional voting, and Condorcet's simple majority principle. *Public Choice*, 28(1):79–88, 1976.
- Peter Fishburn, William Gehrlein, and Eric Maskin. Condorcet proportions and Kelly's conjectures. *Discrete Applied Mathematics*, 1(4):229–252, 1979.
- Mark Garman and Morton Kamien. The paradox of voting: Probability calculations. *Behavioral Science*, 13:306–316, 1968.
- Serge Gaspers, Thomas Kalinowski, Nina Narodytska, and Toby Walsh. Coalitional manipulation for Schulze's rule. In *Proceedings of the 2013 international conference on Autonomous agents and multi-agent systems*, pages 431–438. International Foundation for Autonomous Agents and Multiagent Systems, 2013.
- John Geanakoplos. Three brief proofs of Arrow's impossibility theorem. Economic Theory, 26(1):211-215, 2005.
- William Gehrlein. The expected probability of Condorcet's paradox. *Economics Letters*, 7(1):33–37, 1981.
- William Gehrlein. Approximating the probability that a Condorcet winner exists. 1999.
- William Gehrlein. Condorcet's Paradox. Theory and Decision Library C. Springer, 2006.
- William Gehrlein and Peter Fishburn. The probability of the paradox of voting: A computable solution. *Journal of Economic Theory*, 13(1):14–25, 1976.
- Allan Gibbard. Manipulation of voting schemes: A general result. *Econometrica*, 41(4):587–601, 1973.
- Allan Gibbard. Manipulation of schemes that mix voting with chance. *Econometrica*, 45(3):665–681, 1977.
- Allan Gibbard. Straightforwardness of game forms with lotteries as outcomes. *Econometrica*, 46(3):595–614, 1978.
- Allan Gibbard. Social choice and the Arrow conditions. *Economics and Philoso-phy*, 30(03):269–284, 2014.

- Peter Gärdenfors. Manipulation of social choice functions. *Journal of Economic Theory*, 13:217–228, 1976.
- Peter Gärdenfors. A concise proof of theorem on manipulation of social choice functions. *Public Choice*, 32:137–142, 1977.
- James Green-Armytage. Four Condorcet-Hare hybrid methods for single-winner elections. *Voting matters*, 29:1–14, 2011.
- James Green-Armytage. Strategic voting and nomination. Social Choice and Welfare, 42(1):111–138, 2014.
- James Green-Armytage, Nicolaus Tideman, and Rafael Cosman. Statistical evaluation of voting rules. 2014.
- Bernard Grofman and Scott Feld. If you like the alternative vote (a.k.a. the instant runoff), then you ought to know about the Coombs rule. *Electoral Studies*, 23 (4):641–659, 2004.
- François Guénard and Gilbert Lelièvre. Compléments d'analyse. Number 1 in Compléments d'analyse. E.N.S., 1985.
- Peter Hammond. Interpersonal comparisons of utility: Why and how they are and should be made. In *Interpersonal Comparisons of Well-Being*, pages 200–254. University Press, 1991.
- Lane Hemaspaandra, Rahman Lavaee, and Curtis Menton. Schulze and ranked-pairs voting are fixed-parameter tractable to bribe, manipulate, and control. In *Proceedings of the 2013 international conference on Autonomous agents and multi-agent systems*, pages 1345–1346. International Foundation for Autonomous Agents and Multiagent Systems, 2013.
- Andrew Jennings. Monotonicity and Manipulability of Ordinal and Cardinal Social Choice Functions. BiblioBazaar, 2011.
- Bradford Jones, Benjamin Radcliff, Charles Taber, and Richard Timpone. Condorcet winners and the paradox of voting: Probability calculations for weak preference orders. *The American Political Science Review*, 89(1):137–144, March 1995.
- Nathan Keller. A tight quantitative version of Arrow's impossibility theorem. Journal of the European Mathematical Society, 14(5):1331–1355, 2012.
- Jerry Kelly. Voting anomalies, the number of voters, and the number of alternatives. *Econometrica*, pages 239–251, 1974.
- Jerry Kelly. Almost all social choice rules are highly manipulable, but a few aren't. Social Choice and Welfare, 10:161–175, 1993.
- John Kemeny. Mathematics without numbers. Daedalus, 88:575–591, 1959.
- K.H. Kim and F.W. Roush. Statistical manipulability of social choice functions. *Group Decision and Negotiation*, 5:263–282, 1996.
- Benoît Kloeckner. Un bref aperçu de la géométrie projective. Calvage & Mounet, 2012.

- Kathrin Konczak and Jérôme Lang. Voting procedures with incomplete preferences. In *Proc. IJCAI-05 Multidisciplinary Workshop on Advances in Preference Handling*, 2005.
- David Kreps. A Course in Microeconomic Theory. Princeton University Press, 1990.
- Craig Labovitz, Scott Iekel-Johnson, Danny McPherson, Jon Oberheide, and Farnam Jahanian. Internet inter-domain traffic. In *Proceedings of the ACM SIG-COMM 2010 conference*, pages 75–86, 2010.
- Jérôme Lang, Nicolas Maudet, and Maria Polukarov. New results on equilibria in strategic candidacy. In *Algorithmic Game Theory*, pages 13–25. Springer, 2013.
- Jean-Francois Laslier. Spatial approval voting. *Political Analysis*, 14:160–185(26), 2006.
- Jean-François Laslier. The leader rule: A model of strategic approval voting in a large electorate. *Journal of Theoretical Politics*, 21(1):113–136, 2009.
- Jean-François Laslier and Karine Van der Straeten. A live experiment on approval voting. Experimental Economics, 11(1):97–105, 2008.
- Jean-François Laslier. Le vote et la règle majoritaire. CNRS science politique. CNRS Editions, 2004.
- Stephane Laveau and Olivier Faugeras. Oriented projective geometry for computer vision. In *ECCV96*, pages 147–156. Springer-Verlag, 1996.
- Dominique Lepelley and Boniface Mbih. The proportion of coalitionally unstable situations under the plurality rule. *Economics Letters*, 24(4):311–315, 1987.
- Dominique Lepelley and Boniface Mbih. The vulnerability of four social choice functions to coalitional manipulation of preferences. *Social Choice and Welfare*, 11:253–265, 1994.
- Dominique Lepelley and Vincent Merlin. Choix social positionnel et principe majoritaire. Annales d'Economie et de Statistique, pages 29–48, 1998.
- Dominique Lepelley and Fabrice Valognes. On the Kim and Roush voting procedure. *Group Decision and Negotiation*, 8:109–123, 1999.
- Dominique Lepelley and Fabrice Valognes. Voting rules, manipulability and social homogeneity. *Public Choice*, 116:165–184, 2003.
- Dominique Lepelley, Ahmed Louichi, and Hatem Smaoui. On Ehrhart polynomials and probability calculations in voting theory. *Social Choice and Welfare*, 30:363–383, 2008.
- Ramon Llull. De arte electionis. 1299.
- Ramon Llull. Blanquerna. c. 1285.
- Hans Maassen and Thom Bezembinder. Generating random weak orders and the probability of a Condorcet winner. *Social Choice and Welfare*, 19(3):517–532, 2002.
- Colin Mallows. Non-null ranking models. Biometrika, pages 114–130, 1957.

- Andrew Mao, Ariel Procaccia, and Yiling Chen. Better human computation through principled voting. In *Proceedings of of the 27th Conference on Artificial Intelligence (AAAI'13)*, 2013.
- K. V. Mardia. Statistics of directional data. *Journal of the Royal Statistical Society. Series B (Methodological)*, 37(3):349–393, 1975.
- Andreu Mas-Colell, Michael Whinston, and Jerry Green. *Microeconomic Theory*. Oxford University Press, 1995.
- Nicholas Mattei and Toby Walsh. Preflib: A library of preference data. In *Proceedings of Third International Conference on Algorithmic Decision Theory (ADT 2013)*, Lecture Notes in Artificial Intelligence. Springer, 2013.
- Kenneth May. A set of independent, necessary and sufficient conditions for simple majority decision. *Econometrica*, 20(4):680–684, 1952.
- Robert May. Some mathematical remarks on the paradox of voting. *Behavioral Science*, 16:143–151, 1971.
- Iain McLean. The Borda and Condorcet principles: three medieval applications. Social Choice and Welfare, 7(2):99–108, 1990.
- Vincent Merlin. The axiomatic characterizations of majority voting and scoring rules. *Mathématiques et sciences humaines*, (163), 2003.
- Vincent Merlin, Maria Tataru, and Fabrice Valognes. On the probability that all decision rules select the same winner. *Journal of Mathematical Economics*, 33 (2):183–207, 2000.
- Vincent Merlin, Monica Tataru, and Fabrice Valognes. On the likelihood of Condorcet's profiles. Social Choice and Welfare, 19:193–206, 2002.
- Elchanan Mossel. A quantitative Arrow theorem. *Probability Theory and Related Fields*, 154(1-2):49–88, 2012.
- Hervé Moulin. La Stratégie du vote. Cahiers du CEREMADE. Université Paris IX-Dauphine, Centre de recherche de mathématiques de la décision, 1978.
- Hervé Moulin. On strategy-proofness and single peakedness. *Public Choice*, 35 (4):437–455, 1980.
- Hervé Moulin. Condorcet's principle implies the no show paradox. *Journal of Economic Theory*, 45(1):53–64, June 1988.
- Eitan Muller and Mark Satterthwaite. The equivalence of strong positive association and strategy-proofness. *Journal of Economic Theory*, 14(2):412–418, 1977.
- Roger Myerson. Theoretical comparisons of electoral systems. *European Economic Review*, 43(4):671–697, 1999.
- Nina Narodytska, Toby Walsh, and Lirong Xia. Manipulation of Nanson's and Baldwin's rules. In Workshop on Social Choice and Artificial Intelligence, page 64, 2011.
- Richard Niemi and Herbert Weisberg. A mathematical solution for the probability of the paradox of voting. *Behavioral Science*, 13(4):317–323, 1968.

- Noam Nisam, Tim Roughgarden, Éva Tardos, and Vijay Vazirani. Algorithmic Game Theory. Cambridge University Press, 2007.
- Shmuel Nitzan. The vulnerability of point-voting schemes to preference variation and strategic manipulation. *Public Choice*, 47:349–370, 1985.
- Svetlana Obraztsova and Edith Elkind. On the complexity of voting manipulation under randomized tie-breaking. *COMSOC 2012*, page 347, 2012.
- Svetlana Obraztsova, Edith Elkind, and Noam Hazon. Ties matter: Complexity of voting manipulation revisited. In *The 10th International Conference on Autonomous Agents and Multiagent Systems-Volume 1*, pages 71–78. International Foundation for Autonomous Agents and Multiagent Systems, 2011.
- David Parkes and Lirong Xia. A complexity-of-strategic-behavior comparison between Schulze's rule and ranked pairs. In *Proceedings of the 26th AAAI Conference on Artificial Intelligence (AAAI'12)*. American Association for Artificial Intelligence, 2012.
- Bezalel Peleg. Game theoretic analysis of voting in committees. Number 7 in Econometric Society monographs in pure theory. Cambridge Univ. Press, 1984.
- Joaquín Pérez. The strong no show paradoxes are a common flaw in Condorcet voting correspondences. Social Choice and Welfare, 18(3):601–616, 2001.
- John Pomeranz and Roman Weil Jr. The cyclical majority problem. Commun. ACM, 13:251–254, April 1970.
- Geoffrey Pritchard and Arkadii Slinko. On the average minimum size of a manipulating coalition. Social Choice and Welfare, 27:263–277, 2006.
- Geoffrey Pritchard and Mark Wilson. Exact results on manipulability of positional voting rules. *Social Choice and Welfare*, 29:487–513, 2007.
- Ariel Procaccia and Jeffrey Rosenschein. Junta distributions and the average-case complexity of manipulating elections. In *Proceedings of the fifth international joint conference on Autonomous agents and multiagent systems*, AAMAS '06, pages 497–504. ACM, 2006.
- Ariel Procaccia and Jeffrey Rosenschein. Average-case tractability of manipulation in voting via the fraction of manipulators. In *Proceedings of the 6th international joint conference on Autonomous agents and multiagent systems*, AAMAS '07, page 105. ACM, 2007.
- Philip Reny. Arrow's theorem and the Gibbard-Satterthwaite theorem: a unified approach. *Economics Letters*, 70:99–105, January 2001.
- Reyhaneh Reyhani. Strategic manipulation in voting systems. PhD thesis, 2013.
- Reyhaneh Reyhani, Geoffrey Pritchard, and Mark Wilson. A new measure of the difficulty of manipulation of voting rules, 2009.
- Harold Ruben. On the moments of order statistics in samples from normal populations. Biometrika, 41(1/2):200-227, June 1954.
- Donald Saari. Susceptibility to manipulation. Public Choice, 64(1):21-41, 1990.
- Donald Saari. *Geometry of voting*, volume 3. Springer Science & Business Media, 2012.

- Donald Saari and Vincent Merlin. A geometric examination of Kemeny's rule. Social Choice and Welfare, 17(3):403–438, 2000.
- Mark Satterthwaite. Strategy-proofness and Arrow's conditions: Existence and correspondence theorems for voting procedures and social welfare functions. *Journal of Economic Theory*, 10(2):187–217, 1975.
- Markus Schulze. A new monotonic, clone-independent, reversal symmetric, and Condorcet-consistent single-winner election method. *Social Choice and Welfare*, 36:267–303, 2011.
- Arunava Sen. Another direct proof of the Gibbard-Satterthwaite theorem. *Economics Letters*, 70(3):381–385, 2001.
- Murat Sertel and Remzi Sanver. Strong equilibrium outcomes of voting games are the generalized Condorcet winners. *Social Choice and Welfare*, 22:331–347, 2004.
- Arkadii Slinko. How large should a coalition be to manipulate an election? *Mathematical Social Sciences*, 47(3):289–293, 2004.
- Arkadii Slinko and Shaun White. Nondictatorial social choice rules are safely manipulable. In *COMSOC'08*, pages 403–413, 2008.
- David Smith. Manipulability measures of common social choice functions. *Social Choice and Welfare*, 16:639–661, 1999.
- John Smith. Aggregation of preferences with variable electorate. *Econometrica: Journal of the Econometric Society*, pages 1027–1041, 1973.
- Michael Spivak. A comprehensive introduction to differential geometry. Vol. III. Publish or Perish Inc., second edition, 1979a.
- Michael Spivak. A comprehensive introduction to differential geometry. Vol. IV. Publish or Perish Inc., second edition, 1979b.
- Jorge Stolfi. Oriented projective geometry. In *Proceedings of the third annual symposium on Computational geometry*, SCG '87, pages 76–85. ACM, 1987.
- Alan Taylor. Social choice and the mathematics of manipulation. Outlooks Series. Cambridge University Press, 2005.
- Nicolaus Tideman. Independence of clones as a criterion for voting rules. *Social Choice and Welfare*, 4:185–206, 1987.
- Nicolaus Tideman. Collective Decisions And Voting: The Potential for Public Choice. Ashgate, 2006.
- Ilia Tsetlin, Michel Regenwetter, and Bernard Grofman. The impartial culture maximizes the probability of majority cycles. *Social Choice and Welfare*, 21: 387–398, 2003.
- Gordon Tullock and Colin Campbell. Computer simulation of a small voting system. *The Economic Journal*, 80(317):97–104, 1970.
- Gary Ulrich. Computer generation of distributions on the m-sphere. *Applied Statistics*, pages 158–163, 1984.

- Karine Van der Straeten, Jean-François Laslier, Nicolas Sauger, and André Blais. Strategic, sincere, and heuristic voting under four election rules: an experimental study. *Social Choice and Welfare*, 35(3):435–472, 2010.
- John Von Neumann and Oskar Morgenstern. Theory of games and economic behavior. Princeton University Press, 1944.
- John Von Neumann, Oskar Morgenstern, Harold Kuhn, and Ariel Rubinstein. Theory of Games and Economic Behavior (Commemorative Edition). Princeton Classic Editions. Princeton University Press, 2007.
- Toby Walsh. Manipulability of single transferable vote. In F. Brandt, V. Conitzer, L. Hemaspaandra, J.-F. Laslier, and W. Zwicker, editors, Computational Foundations of Social Choice, number 10101 in Dagstuhl Seminar Proceedings. Schloss Dagstuhl - Leibniz-Zentrum für Informatik, Germany, 2010a.
- Toby Walsh. An empirical study of the manipulability of single transferable voting. In *ECAI*, volume 10, pages 257–262, 2010b.
- Tiance Wang, Paul Cuff, and Sanjeev Kulkarni. Condorcet methods are less susceptible to strategic voting. 2014.
- G.S. Watson and E.J. Williams. On the construction of significance tests on the circle and the sphere. *Biometrika*, 43(3/4):344–352, 1956.
- Tjark Weber. Alternatives vs. outcomes: A note on the Gibbard-Satterthwaite theorem. Technical report, 2009.
- Andrew Wood. Simulation of the Von Mises Fisher distribution. Communications in Statistics-Simulation and Computation, 23(1):157–164, 1994.
- Eduardo Xavier. A note on a maximum k-subset intersection problem. *Information Processing Letters*, 112(12):471–472, 2012.
- Lirong Xia and Vincent Conitzer. Generalized scoring rules and the frequency of coalitional manipulability. In *Proceedings of the 9th ACM Conference on Electronic Commerce*, pages 109–118. ACM, 2008.
- Lirong Xia, Michael Zuckerman, Ariel Procaccia, Vincent Conitzer, and Jeffrey Rosenschein. Complexity of unweighted coalitional manipulation under some common voting rules. In *International Joint Conference on Artificial Intelli*gence, pages 348–353, 2009.
- Peyton Young and Arthur Levenglick. A consistent extension of Condorcet's election principle. SIAM Journal on Applied Mathematics, 35(2), 1978.
- Michael Zuckerman, Ariel Procaccia, and Jeffrey Rosenschein. Algorithms for the coalitional manipulation problem. *Artificial Intelligence*, 173(2):392–412, 2009.
- Michael Zuckerman, Omer Lev, and Jeffrey Rosenschein. An algorithm for the coalitional manipulation problem under Maximin. In *The 10th International Conference on Autonomous Agents and Multiagent Systems Volume 2*, AA-MAS '11, pages 845–852, 2011.