# Coordination and Bandwagon Effects: How Past Rankings Shape the Behavior of Voters and Candidates $^{\dagger}$

By RIAKO GRANZIER, VINCENT PONS, AND CLEMENCE TRICAUD\*

Candidates' placements in polls and past elections can be powerful coordination devices for parties and voters. Using a regression discontinuity design in French two-round elections, we show that candidates who place first in the first round are more likely to stay in the race and win than those who placed second. These effects are even larger for ranking second versus third, and also present for third versus fourth. They stem from allied parties agreeing on which candidate should drop out, voters coordinating their choice, and the bandwagon effect of wanting to vote for the winner. We find similar results across 19 other countries. (JEL D72, D83, D91, K16)

E lections are massive coordination games. While some voters make their choice based only on their own preferences (e.g., Pons and Tricaud 2018; Spenkuch 2018), others will strategically shift their support away from their preferred candidate toward one they like less but expect to have a better chance of winning (e.g., Duverger 1954; Myerson and Weber 1993; Cox 1997). Similarly, candidates can decide whether or not to enter the race based on the fraction of the electorate they expect to vote for them versus their competitors. They might choose to stay out of the race if they foresee that they will receive few votes or that their presence could divide their camp and undermine their cause.

\* Granzier: Uber (email: riagn@uber.com); Pons: Harvard Business School, CEPR, and NBER (email: vpons@ hbs.edu); Tricaud: UCLA Anderson and CEPR (email: clemence.tricaud@anderson.ucla.edu). Ilyana Kuziemko was coeditor for this article. For suggestions that have improved this article, we are grateful to Alberto Alesina, Abhijit Banerjee, Laurent Bouton, Pierre Boyer, Julia Cagé, Enrico Cantoni, Gary Cox, Rafael Di Tella, Allan Drazen, Andrew Eggers, Jon Fiva, Jeffry Frieden, Olivier Gossner, Benjamin Marx, Shom Mazumder, Benjamin Olken, Thomas Piketty, James Snyder, and Matthew Weinzierl; as well as seminar participants at Berkeley, CREST, Ecole Polytechnique, European University Institute, Georgia State University, Kellogg School of Management, New York University, Paris School of Economics, Princeton University, Rice University, Stanford University, Texas A&M, UCLA Anderson, UCSD, USC Marshall School of Business, Université Laval, University of Bologna, University of Maryland, and Vanderbilt University; and conference participants at the APSA Annual Meeting, the Economics and Politics Workshop, the Annual Congress of the European Economic Association, the International Conference on Mathematical Optimization for Fair Social Decisions, Michel Balinski's Conference, the Political Economy Workshop at the Norwegian Business School, and Sciences Po Quanti. We thank Sebastian Calonico, Matias Cattaneo, Max Farrell, and Rocio Titiunik for guiding us through the use of their RDD Stata package "rdrobust" and for sharing their upgrades; Nicolas Sauger for his help with the collection of the 1958, 1962, 1967, 1968, 1973, 1981, and 1988 French parliamentary election results; Abel François for sharing his data on 1993, 1997, and 2002 candidates' campaign expenditures; Paul-Adrien Hyppolite for the excellent research assistance he provided at the onset of the project; and Eric Dubois for his outstanding work of data entry and cleaning.

<sup>†</sup>Go to https://doi.org/10.1257/app.20210840 to visit the article page for additional materials and author disclosure statement(s) or to comment in the online discussion forum.

Predicting the behavior of the entire electorate and adjusting one's own decisions accordingly is challenging for both voters and candidates. Opinion polls and previous electoral results may be useful sources of information. However, despite a large body of evidence that the overall informedness of political actors matters (e.g., Hall and Snyder 2015; Le Pennec and Pons 2020), little is known about which particular pieces of information they use to make their decisions and how exactly this information shapes their behavior.

In this paper, we focus on one specific type of information: the ranking of candidates by performance in polls, previous elections, or a previous round of the same election. While past and predicted vote shares provide detailed information on the distribution of preferences, rough-hewn candidate rankings can serve as a coordination device in and of themselves. When more than two candidates are in the running, their past rankings can be used by strategic voters as a focal point to coordinate on the same subset of candidates. Past rankings can also be used by sister parties to determine which of their candidates should drop out in order to increase their collective chance of victory. These mechanisms, which we henceforth refer to as "strategic coordination," can be reinforced by behavioral forces such as a bandwagon effect: voters who gain satisfaction by being on the winning side might decide to "jump on the bandwagon" and rally behind candidates who won or had a higher rank in the past.

Elections using a two-round plurality voting rule are an ideal setting to estimate the impact of rankings and disentangle the underlying mechanisms. Our main sample includes a total of 22,557 individual races in 26 French local and parliamentary elections from 1958 to 2017. In these elections, up to three or four candidates can qualify for the second round. This enables us to measure the effect on second-round outcomes of placing first (instead of second), second (instead of third), and third (instead of fourth) in the first round. In addition, all candidates who qualify for the second round can decide to drop out of the race. We can thus estimate the impact of first-round rankings both on voter choice and on candidate decision to run in the second round.

To separate the effect of rankings from the effect of differences in vote shares (e.g., Knight and Schiff 2010), we use a regression discontinuity design (RDD) and compare the likelihood of running, the likelihood of winning, and the second-round vote share obtained by candidates who received close-to-identical numbers of votes in the first round but ranked just below or just above one another.

Our empirical design draws on studies measuring the impact of candidate placements across separate elections. Following Lee (2008), many papers have examined the impact of ranking first (instead of second) on future elections and shown that winners of close contests generally benefit from an incumbency advantage when they run again (e.g., Ferreira and Gyourko 2009; Eggers et al. 2015; Erikson and Titiunik 2015; Fiva and Smith 2018).<sup>1</sup> Anagol and Fujiwara (2016) focus on a second discontinuity. They show that ranking second (instead of third) in past elections

<sup>&</sup>lt;sup>1</sup>Many papers studied the incumbency advantage before Lee (2008) but did so using methods different from RDDs (e.g., Erikson 1971; Gelman and King 1990; Cox and Katz 1996; Ansolabehere et al. 2000).

also increases a candidate's likelihood to run in the next one and win it—effects they attribute to strategic coordination by voters.<sup>2</sup>

By contrast, we estimate the effects of candidate rankings across different rounds of the same election. Our setting offers several key advantages. First and foremost, it enables us to identify the mechanisms underlying rankings' effects. Since the number of candidates who qualify for the second round varies from two to four, we can compare races where more than two candidates qualified (and rankings can be used to coordinate) to races where only two candidates qualified (and there is no need for coordination). This allows us to uncover the bandwagon effect, a new channel underlying rankings' effects, and to cleanly separate its contribution from strategic coordination. Second, researchers typically do not observe candidates who considered participating in an election but eventually decided to stay out of it. By contrast, qualification for the second round of two-round elections is entirely determined by first-round results, so we observe the full set of possible competitors in the second round. This helps us interpret each qualified candidate's decision to stay in the race or drop out, and decipher parties' strategies, on which there is little causal evidence to date. Third, the two rounds are separated by only one week, which helps us isolate the direct effect of rankings from reinforcing effects that are more likely to matter when considering elections separated by several years, such as the increased notoriety of the higher-ranked candidates and their lower likelihood of being replaced by another candidate from their party. Fourth, focusing on first-round rankings enables us to measure the impact of ranking first instead of second independently from the effect of holding office, contributing to a better understanding of the incumbency advantage. Finally, we can replicate our main results in 19 other countries also using the two-round system, increasing the external validity of our findings.

We first show that rankings substantially affect the outcome of elections. In French elections, placing first instead of second increases candidates' likelihood to win the race by 5.8 percentage points. This result suggests that the advantage enjoyed by incumbents in future elections is partly driven by the pure effect of ranking first. Placing second instead of third has an even larger effect, of 9.9 percentage points, and coming in third instead of fourth has an effect of 2.2 percentage points, from a baseline of only 0.5 percent.

Next, our exploration of mechanisms begins by assessing the extent to which the overall effects on winning are driven by candidate or voter choice. We find that placing first instead of second, second instead of third, and third instead of fourth increases candidates' likelihood to stay in the race by 5.6, 23.5, and 14.6 percentage points, respectively. Yet, a candidate's decision to stay in the race does not account for the full effects on winning. We estimate the effects of rankings on voter choice conditional on candidates' presence in the second round using a bounding strategy, in order to deal with the fact that lower- and higher-ranked candidates who decide to stay in the race may have different characteristics. We find that placing first instead of second increases a candidate's vote share by more than 1.3 percentage points and increases likelihood of winning conditional on staying in the race by more than

 $<sup>^{2}</sup>$ Laboratory experiments have also found that voters tend to coordinate on candidates placed higher in polls or in previous rounds of an election game (Forsythe et al. 1993; Bouton et al. 2016).

2.9 percentage points. The lower bounds on the effects of ranking second instead of third (respectively, third instead of fourth) are 4.0 and 6.9 percentage points (respectively, 2.5 and 3.0). Variations in effect size across different precincts of the same district provide suggestive evidence that effects on voter behavior are driven by active voters rallying behind higher-ranked candidates more than by the differential mobilization of nonvoters.

To uncover the mechanisms responsible for the effects of rankings on candidate and voter choice, we go one step further and check how effect size varies with the number and type of candidates who qualify for the second round.

First, we show that the effects are much larger when the higher- and lower-ranked candidates have the same political orientation. This can arise from the fact that shared orientation makes it more appealing for voters and candidates to coordinate against ideologically distant candidates who also qualified, but also from the fact that it makes rallying behind the higher-ranked candidate less costly, whatever the underlying motive may be.

Second, to investigate the extent to which coordination explains our results, we focus on elections in which three or more candidates qualify for the second round (and rankings can be used to coordinate on a subset of them) and compare the effects of placing first instead of second depending on the challenge posed by the third candidate. We find that the effects on running and winning decrease with the gap between the second and third candidates' vote shares. This suggests that coordination between the first and second candidates (which is more critical when the gap with the third is narrower) explains part of the effects.

Third, to test whether strategic coordination suffices to explain our results, we turn to elections in which the third candidate does not qualify and the candidates ranked first and second in the first round are the only ones allowed to compete in the second round. In elections with only two qualified candidates, there is no need or even possibility for coordination against a lower-ranked candidate. All voters should vote for their preferred candidate among the top two, and candidates do not risk contributing to the victory of a disliked competitor by running. Hence, if the effects of rankings were driven exclusively by strategic coordination, we should find a null impact in those elections. Instead, we still find a large effect of ranking first instead of second on running and on winning, conditional on running. In contrast to previous studies, we infer that strategic coordination cannot fully account for the impact of rankings. Our results first indicate that candidate dropouts are not only driven by the desire to avoid the victory of a third candidate: they often stem from agreements between left-wing parties, which consider that the first-round choice of their supporters should determine the winner when the only two candidates qualifying for the second round are on the left. In addition, effects conditional on staying in the race reveal that the desire to be on the winning side is an important driver of voter behavior and that it generates a bandwagon effect swaying many elections.

Finally, we consider the possibility that factors other than voter choice drive the effects of rankings on a candidate's likelihood of winning and on their vote share conditional on staying in. We show that the effects are unlikely to be explained by differences in the campaign expenditures of the higher- and lower-ranked candidates or

by the decisions of other qualified candidates to stay in the race or drop out. Neither does media coverage drive our results. We collected a total of 76,679 election-related newspaper articles that were released between the two rounds of all local and parliamentary elections since 1997. We do not find any effect on the amount of newspaper coverage of higher- versus lower-ranked candidates. After reading and annotating a random subset of articles, we also find that the media do not cover higher-ranked candidates more favorably either.

The effects of past rankings are present both for left-wing and right-wing candidates, sizable in both local and parliamentary elections, and as large today as in previous decades. Moreover, we check the external validity of our results in a separate sample of 72 parliamentary elections in 19 countries since 1850 (Albania, Bahrain, Belgium, Comoros, Croatia, Czech Republic, Georgia, Germany, Haiti, Hungary, Kiribati, Lithuania, Mali, Mauritania, the Netherlands, New Zealand, Norway, Poland, and Switzerland). This sample includes all elections worldwide for upper or lower houses of parliament that use a two-round plurality rule and for which we were able to find results at the constituency level, using a large number of sources. While this sample totals far fewer races than the French sample (4,075 against 22,557) and the corresponding data are less rich, they enable us to verify that our results are not specific to the French context. Similarly as in French elections, we find that ranking first instead of second and ranking second instead of third have large effects on candidates' likelihood of winning, of 7.6 and 15.8 percentage points, respectively; that the effect of placing first is larger when the third candidate poses more of a challenge for the top two, again pointing to the role of strategic coordination; and that placing first has an effect even when the third candidate does not qualify for the second round, indicating that mechanisms other than coordination, such as the bandwagon effect, contribute to rankings' effects in other countries as well. The effects of ranking higher in the first round on candidates' likelihood to run in the second round are smaller in this sample than in French elections, but the effects on winning are larger, suggesting that voter choice contributes relatively more to the effects in these 19 other countries overall.

Beyond two-round elections, our estimates carry implications for any election in which preelectoral information on candidate rankings is available from previous rounds or opinion polls. Overall, our analysis reveals that rankings are a public signal of paramount importance, influencing the choices of many voters and candidates. We further shed light on the motivations underlying the decisions of political actors. While rankings facilitate strategic coordination among parties and voters, which can in turn enhance the representativeness of elected leaders, they also unleash behavioral effects, which may have the opposite consequence. The effects of rankings should enter into consideration when debating voting rules and regulating the polling industry, as they are likely to be magnified in voting systems with two rounds or other forms of sequential voting, and when poll results are released just before the election. Furthermore, our results have important implications for campaign strategies: the importance of ranking high early gives candidates strong incentives to front-load some of their voter outreach efforts even if the effects of persuasive communication may decay over time. *Contribution to the Literature.*—Our exploration of rankings' effects and of the mechanisms underlying them contributes to a large political economy literature investigating how voters choose elected officials, and to a smaller but equally important literature studying how parties' strategies can constrain the set of candidates among whom voters choose.

Many empirical studies focus on the tension between expressive and strategic motives of voting (e.g., Fujiwara 2011; Eggers 2015; Spenkuch 2015), and seek to estimate the fractions of citizens voting based on likely outcomes of the election versus their preference among candidates alone (e.g., Alvarez and Nagler 2000; Kawai and Watanabe 2013; Spenkuch 2018; Eggers and Vivyan 2020). In Pons and Tricaud (2018), we use a subset of French two-round elections used in the present paper and exploit variation in the presence of a third candidate in the runoff to assess the extent to which voters behave expressively or strategically. Importantly, voters who want to be strategic still need to decide which equilibrium to focus on. Indeed, models of strategic voting show that voter coordination tends to lead to equilibria in which two candidates receive most of the votes, but that multiple equilibria of this type generally exist (Palfrey 1989; Myerson and Weber 1993; Cox 1997). In the presence of multiple equilibria, public signals may facilitate convergence to a unique one. Fey (1997) establishes that a sequence of opinion polls providing information about the distribution of preferences and strategies in the electorate can bring voters to focus on the same pair of candidates. Myatt (2007) finds that a single poll observed by everyone may suffice to generate full coordination (where only two candidates obtain votes) if it is sufficiently precise.

Building on this theoretical work on equilibrium selection, we study how voter coordination works in practice and document the importance of a specific signal: candidate rankings. We show that rankings enable the decentralized coordination of strategic voters by serving as focal points: voters are more likely to coordinate on higher-ranked candidates even in the extreme case where these candidates obtained exactly the same vote share as lower-ranked ones.

Beyond the trade-off between expressive and strategic voting, voter choice can also be influenced by the desire to be on the winning side (Simon 1954; Fleitas 1971; Bartels 1988). Several laboratory experiments have shown that voters rallying behind the predicted winner will generate a bandwagon effect further increasing her lead (e.g., Morton and Williams 1999; Hung and Plott 2001; Morton and Ou 2015; Agranov et al. 2018). Outside the lab, Bartels (1985) and McAllister and Studlar (1991) show that many voters report favoring candidates they deem most likely to win, but the authors note that people's assessment of candidate chances may be affected by their voting intention. This concern of reverse causality is absent from studies documenting systematic overreporting of voting for the winner in postelectoral surveys (e.g., Wright 1993; Atkeson 1999), a pattern nonetheless consistent with interpretations other than the desire to side with the winning candidate, such as respondent selection effects (Gelman et al. 2016) and social desirability bias. Morton et al. (2015) compare electoral results in French territories overseas between elections in which these territories voted before or after the overall election outcome had been made public through exit polls. While this natural experiment is one of the best pieces of evidence of bandwagon voting, the fact that the change took place simultaneously in all overseas territories makes it difficult to disentangle its effect from concomitant factors.

We build on this body of work and provide causal evidence on the bandwagon effect using the electoral results of a large number of individual races.<sup>3</sup> Our results showing a preference to vote for the winner bring empirical support for models assuming that voters gain utility from this choice (Hinich 1981; Callander 2007, 2008).<sup>4</sup> Social learning represents a complementary interpretation for voters' tendency to rally behind leading candidates, including in races in which there is no need for strategic coordination. Voters may use (discrete) rankings as a heuristic about the (continuous) distribution of the choice of others, in line with abundant evidence on bounded rationality (Tversky and Kahneman 1981; Kahneman 2003). In turn, they may interpret others' vote choice as a signal about candidate valence and update their own preferences accordingly (e.g., Banerjee 1992; Feddersen and Pesendorfer 1997). We discuss the extent to which social learning may contribute to explaining our results in Section IVC, and we provide evidence that its role is likely to be limited.

In addition to our results on voter behavior, our paper gives groundbreaking evidence on the strategies of candidates and parties. Most models of elections assume an exogenous pool of candidates. Models with endogenous candidate entry (Osborne and Slivinski 1996; Besley and Coate 1997; Solow 2016; Dal Bo and Finan 2018) and exit (Indridason 2008) focus on individual candidates' choice of whether to run. In the real world, however, agreements between parties can also lead a candidate to drop out, thus restricting voters' options. This form of coordination may be expected to be more effective than voter coordination, since it requires the cooperation of a smaller number of actors with greater stakes in electoral outcomes. A small number of empirical studies emphasize the importance of electoral alliances between parties and examine factors conducive to coordination, such as ideological proximity and disproportional electoral rules, but the evidence they present is only correlational (e.g., Golder 2005, 2006; Blais and Indridason 2007; Blais and Loewen 2009). While an essential aspect of electoral politics, party coordination tends to be difficult to study, because one usually only observes candidates who are actually competing, not those who considered it but chose not to. By contrast, since we observe the full set of candidates eligible to compete in the runoff, whether or not they actually stay in the race, we can cleanly estimate and characterize the contribution of candidate and party coordination to the effects of rankings. We find evidence that dropout agreements between parties of similar orientation are motivated by the desire to avoid the victory of a candidate of a different orientation as well as other motives such as following the first-round choice of their supporters.

<sup>&</sup>lt;sup>3</sup>Similarly to our setting, Kiss and Simonovits (2014) study the bandwagon effect in two-round elections in Hungary. Differently from our strategy, they compare the size of the difference between the first and second candidates' vote shares in the first and second rounds. They interpret the increase in the winning margin as evidence that first-round results had a bandwagon effect on second-round vote choices. However, differences between the first and second rounds other than the availability of first-round results could drive this pattern.

<sup>&</sup>lt;sup>4</sup>The bandwagon effect of candidate rankings is akin to the effects measured in other contexts beyond elections, such as asset rankings on trading behavior (Hartzmark 2015), hospitals' rankings on their number of patients and revenues (Pope 2009), employees' rankings on their sales (Barankay 2018), and students' rankings on their academic performance (Murphy and Weinhardt 2020).

Finally, our results on the effects of rankings on party decisions between rounds contribute to a rich literature exploring the properties of two-round voting systems (e.g., Osborne and Slivinski 1996; Piketty 2000; Bouton 2013; Bordignon et al. 2016; Bouton et al. 2019; Cipullo 2021), and they echo recent work showing that parties tend to promote candidates ranked higher by voters in open-list elections (Folke et al. 2016; Meriläinen and Tukiainen 2016; Cirone et al. 2020), that parties' likelihood to appoint a government increases when they receive more seats or votes (Fujiwara and Sanz 2020),<sup>5</sup> and that incumbents elected with a higher rank in multi-member districts are more likely to win higher office in future elections (Dulay and Go 2021). On top of affecting party coordination and candidate promotion at the post-electoral stage, our paper shows that rankings also drive candidates and parties' decision to enter in the election in the first place.

The remainder of the paper is organized as follows. We provide more details on our setting and empirical strategy in Section II. Section III presents our main results and Section IV discusses the underlying mechanisms. Section V documents the external validity of the results and Section VI concludes.

## I. Empirical Strategy

# A. Setting

Our main sample includes 14 parliamentary elections and 12 local elections: all parliamentary elections of the Fifth Republic from 1958 to 2017 except for the 1986 election (which used proportionality rule), and all local elections from 1979 to 2015.<sup>6</sup> Each of these 26 elections took place on a different date.<sup>7</sup>

Every five years, parliamentary elections elect the National Assembly, the lower house of the French Parliament. In these elections, each of 577 constituencies elects a Member of Parliament. Local elections determine the members of the departmental councils, which have authority over transportation, education, and social assistance, among other areas. France is divided into 101 départements, each of which is further divided into cantons. Until a 2013 reform, local elections took place every three years. In each département, half of the cantons elected their council member in any given election, for a length of six years, and the other half of cantons participated in the next election. After the reform, all cantons participated in elections held

<sup>5</sup>In addition to the norm that the most voted party forms the government, coalition governments generally follow a second norm, often referred to as Gamson's (1961) law: in such governments, each party tends to receive a share of the cabinet's portfolio proportional to its seat share in the parliament (e.g., Browne and Franklin 1973; Warwick and Druckman 2006). These patterns, as well as the use of candidate rankings for between-round coordination which we uncover in this paper, illustrate parties' tendency to solve complex bargaining problems with simple norm-based decision rules.

<sup>6</sup>We do not include local elections held before 1979 as the electoral rule allowed any candidate to run in the second round, irrespective of their vote share in the first and even if they were absent from the first.

<sup>&</sup>lt;sup>7</sup> In 1988, both parliamentary and local elections were held, but in different months. The 2001 and 2008 local elections took place on the same date as municipal elections, and the 1992, 1998, and 2004 local elections on the same date as regional elections. Our results remain very similar and, if anything, only increase in magnitude and statistical significance, when we exclude these elections (see online Appendix Tables F6 and F7).

every six years and each canton elected a ticket composed of a man and a woman.<sup>8</sup> This new rule applied to the 2015 local elections. In our analysis, we consider each ticket as a single candidate, since the two candidates on the ticket organize a common electoral campaign and get elected or defeated together. Henceforth, we define both assembly constituencies and local cantons as "districts."

Parliamentary and local elections both use a two-round plurality voting rule. A candidate can only win directly in the first round if they obtain more than 50 percent of the candidate votes and if their number of votes is also greater than 25 percent of the registered citizens. In most races, no candidate wins in the first round, the first-round results are publicized, and the second round takes place one week later. In that case, the candidate who receives the largest vote share in the second round wins the election. This type of voting rule is not uncommon: next to plurality voting, uninominal elections with two rounds are among the most common electoral systems in the world (Farrell 2011; Bormann and Golder 2013). The specific conditions required to qualify for the second round of French local and parliamentary elections are more unusual.

The set of candidates who qualify for the second round includes the two candidates with the highest vote share in the first round, as well as any other candidate with a vote share higher than a certain threshold. This rule is essential for our study design, as it enables us to estimate the impact of placing first instead of second, second instead of third, and third instead of fourth. The qualification threshold changed over time: the required vote share was 10 percent of the registered citizens in local elections, until 2011, when it was increased to 12.5 percent.<sup>9</sup> In parliamentary elections, the required vote share was 5 percent of the voters in 1958 and 1962, it was changed to 10 percent of the registered citizens in 1976.

Importantly, all qualifying candidates can decide to drop out of the race between rounds. This allows us to estimate the impact of first-round rankings both on voters' choice of candidate in the second round and on candidates' decision to stay in the second round. Candidates who choose to stay in the race do not have to pay any extra administrative fee. In the second round, voters can only cast a ballot for a candidate who stayed in. In polling booths, paper ballots bearing the names of these candidates are ordered by alphabetical order (in municipalities below 1,000 inhabitants) or by random order (in municipalities above 1,000 inhabitants), independently of first-round rankings.

## B. Data

After excluding races with a unique candidate in the first round and those with no second round, our sample comprises 16,222 races from local elections and 6,335 races from parliamentary elections, for a total of 22,557. We obtained official electoral results from the French Ministry of the Interior (Ministère de l'Intérieur Français 1992–2017) for the 1993 to 2017 parliamentary elections and the 1992 to

<sup>&</sup>lt;sup>8</sup>The 2013 reform further reduced the number of cantons from 4,035 to 2,054, to leave the total number of council members roughly unchanged.

<sup>&</sup>lt;sup>9</sup>In the 2011 local elections, the threshold remained at 10 percent in the 9 cantons belonging to Mayotte département.

2015 local elections, and digitized results from printed booklets for the 1958 to 1988 parliamentary elections and the 1979 to 1988 local elections.<sup>10</sup> Online Appendix Table A1 gives the breakdown of the number of races by election type and year.

To measure the impact of ranking first instead of second (henceforth "1vs2"), we further exclude races in which two of the top three candidates obtain an identical number of votes in the first round (sample 1).<sup>11</sup> Indeed, we do not have any way to choose which candidate to treat as first, when the top two obtained the same number of votes, and which candidate to compare to the first, when the two candidates ranked below her obtained the same number of votes. To measure the impact of ranking second instead of third (henceforth "2vs3"), we restrict our sample to races where at least three candidates compete in the first round and the third qualifies for the second round, and we exclude races in which two of the top four candidates receive an identical number of votes in the first round (sample 2). To measure the impact of ranking third instead of fourth (henceforth "3vs4"), we restrict our sample to races where at least four candidates compete in the first round and the third and fourth qualify for the second round, and we exclude races in which two candidates among the second, third, fourth, and fifth obtain an identical number of votes in the first round and the third among the second, third, fourth, and

Thanks to the large set of local and parliamentary elections we consider, and to the large number of races in each election, our sample includes many close races: the vote share difference between the candidates ranked first and second (respectively, second and third, and third and fourth) is under 2 percentage points in 2,581 races in sample 1, in 1,874 races in sample 2, and in 758 races in sample 3.

Table 1 shows descriptive statistics on the full sample. In the average race, 6.5 candidates competed in the first round, 63.6 percent of registered citizens voted in it, and 61.3 percent cast a valid vote for one of the candidates (henceforth "candidate votes"), as opposed to casting a blank or null vote. In the second round, the number of competing candidates ranged from 1 to 6, with an average of 2.1. Turnout was slightly higher than in the first round (62.8 percent on average) but the fraction of candidate votes was slightly lower (59.5 percent). Overall, the descriptive statistics reported in online Appendix Tables A2, A3, and A4 indicate that close races in samples 1, 2, and 3 are very similar to other races in these samples, including in terms of voter turnout. Similarly, online Appendix Figure A1 shows that second-round participation is not substantially higher in races which were close in the first round than in the rest of the sample, on average.

The statistics shown in Table 1 are at the race level. By contrast, the analysis below is conducted at the candidate level and uses exactly two observations per race, for the higher- and lower-ranked candidates. We allocate candidates to six

<sup>&</sup>lt;sup>10</sup>We had to digitize electoral results prior to 1988 because these results were only available from the Website of the Centre de Données Socio-Politiques (CDSP, https://cdsp.sciences-po.fr/en/), in a format aggregating the vote shares of all candidates sharing the same political label and without candidates' names. Instead, our identification strategy requires knowing the exact vote share and rank of each candidate. In addition, we use the names of candidates to infer their gender and to identify candidates who were already present in previous elections.

<sup>&</sup>lt;sup>11</sup> By "two of the top three candidates," we mean the top two if only two candidates competed in the first round, and two of the top three candidates if three or more candidates competed in the first round. The same applies to the next restrictions.

|                       | Mean   | SD     | Min   | Max     | Observations |
|-----------------------|--------|--------|-------|---------|--------------|
| Panel A. First round  |        |        |       |         |              |
| Registered voters     | 28,294 | 28,157 | 258   | 200,205 | 22,557       |
| Turnout               | 0.636  | 0.125  | 0.094 | 0.921   | 22,557       |
| Candidate votes       | 0.613  | 0.122  | 0.093 | 0.914   | 22,557       |
| Number of candidates  | 6.5    | 3.1    | 2     | 48      | 22,557       |
| Panel B. Second round |        |        |       |         |              |
| Turnout               | 0.628  | 0.134  | 0.117 | 0.968   | 22,557       |
| Candidate votes       | 0.595  | 0.138  | 0.103 | 0.963   | 22,557       |
| Number of candidates  | 2.1    | 0.4    | 1     | 6       | 22,557       |
|                       |        |        |       |         |              |

TABLE 1—SUMMARY STATISTICS

political orientations (far-left, left, center, right, far-right, and other) based on labels attributed to them by the Ministry of the Interior.<sup>12</sup>

# C. Evaluation Framework

We exploit close races to estimate the impact of candidates' first-round rankings on their second-round outcomes. To measure the impact of ranking 1vs2, we use two observations per race, corresponding to the candidates placed first and second in the first round, and define the running variable  $X_1$  as the difference between each candidate's vote share and the vote share of the other top-two candidate. For the candidate ranked first, the running variable is equal to her vote share minus the vote share of the candidate ranked second. For the candidate ranked second, it is equal to her vote share minus the vote share of the candidate ranked first:

$$X_1 = \begin{cases} voteshare_1 - voteshare_2, & \text{if ranked 1st;} \\ voteshare_2 - voteshare_1, & \text{if ranked 2nd.} \end{cases}$$

Similarly, for 2vs3 and 3vs4, we define the running variables  $X_2$  and  $X_3$  as:

$$X_{2} = \begin{cases} voteshare_{2} - voteshare_{3}, & \text{if ranked 2nd;} \\ voteshare_{3} - voteshare_{2}, & \text{if ranked 3rd;} \end{cases}$$
$$X_{3} = \begin{cases} voteshare_{3} - voteshare_{4}, & \text{if ranked 3rd;} \\ voteshare_{4} - voteshare_{3}, & \text{if ranked 4th.} \end{cases}$$

We define the treatment variable *T* as a dummy equal to 1 if the candidate had a higher rank in the first round (X > 0) and 0 otherwise, and we evaluate the impact of placing higher with the following specification:

(1) 
$$Y_i = \alpha_1 + \tau T_i + \beta_1 X_i + \beta_2 X_i T_i + \mu_i,$$

<sup>12</sup>To attribute political labels to candidates, the French Ministry of the Interior takes into account their self-reported political affiliation, party endorsement, past candidacies, and public declarations, among other indicators. Online Appendix H shows our mapping between these political labels and the six orientations, for each election.

where  $Y_i$  is the outcome of interest for candidate *i*. We run this specification separately for 1vs2, 2vs3, and 3vs4. It estimates the impact of rankings at the limit, when both candidates have an identical vote share. Therefore, it enables us to isolate the impact of ranking from the difference in vote shares.

The specification in equation (1) uses a non-parametric approach, following Imbens and Lemieux (2008) and Calonico, Cattaneo, and Titiunik (2014). It amounts to fitting two linear regressions on, respectively, candidates close to the left of the threshold, and close to the right. In online Appendix C, we show the robustness of the results to a quadratic specification, which includes  $X_i^2$  and its interaction with  $T_i$  as regressors. In all regressions, we cluster our standard errors at the district level.<sup>13</sup>

Our main specification uses Calonico, Cattaneo, and Titiunik's (2014) estimation procedure, which provides robust confidence interval estimators, and the MSERD bandwidths developed by Calonico et al. (2019), which reduce potential bias the most. We test the robustness of our results to using a wide range of other bandwidths, including the optimal bandwidths computed according to Imbens and Kalyanaraman (2012) and tighter bandwidths corresponding to half of the MSERD bandwidths. All these bandwidths are data-driven and, therefore, vary with the samples and outcomes used in the regressions.

## D. Identification Assumption

Our identification assumption is that all candidate characteristics change continuously around the threshold and, therefore, that the only discrete change occurring at this threshold is the shift in candidate rankings. Sorting of candidates across the discontinuity only threatens the validity of this assumption if it occurs exactly at the cutoff, with candidates of a particular type pushed just above or just below it (de la Cuesta and Imai 2016). This would require some candidates to be able to predict election outcomes and deploy campaign resources with extreme accuracy, which is unlikely for at least two reasons. First, unpredictable factors including weather conditions on Election Day make the outcome of the election uncertain (Eggers et al. 2015). Second, very limited information is available about voters' intentions in the first round of French parliamentary or local races. Polls specific to a given district are very rare during parliamentary elections, and nonexistent during local ones.

To bring empirical support for the identification assumption, it is customary for RDDs to check if there is a jump in the density of the running variable at the threshold, using a test designed by McCrary (2008). In our setting, this test is satisfied by construction since we consider the same set of races on both sides of the threshold and, in each race, the higher- and lower-ranked candidates are equally distant to the cutoff (see online Appendix Figure A2).

<sup>&</sup>lt;sup>13</sup>Calonico, Cattaneo, and Titiunik's (2014) "rdrobust" command only allows us to cluster separately on each side of the discontinuity, implying that the higher- and lower-ranked candidates competing in the same race fall in separate clusters. We check that our main results are robust to using the conventional estimation procedure (with the command "ivreg2") and clustering the standard errors at the district level, with clusters encompassing observations located on both sides of the threshold (see online Appendix Table C5).

Similarly, first-round variables such as district size, the total number of candidates, voter turnout, or the candidate's vote share are smooth by construction at the threshold.<sup>14</sup>

To provide additional support for the identification assumption, we consider variables whose distribution at the threshold is not mechanically symmetric: the candidate's gender; whether she ran in the previous election, in the same département and then in the exact same district; whether she won a race in the previous election, in the same département and then in the exact same district; whether she runs with or without the label of a political party;<sup>15</sup> a set of six dummies indicating her political orientation: whether this orientation is the same as the incumbent's: the number of candidates of her orientation who were present in the first round; the number of candidates of her orientation who did not qualify for the second round; her strength in the first round, defined as the sum of first-round vote shares of all candidates of the same orientation; the total vote share of same-orientation candidates who did not qualify for the second round; and the average strength of her orientation at the national level in the first round. We first examine whether there is a discontinuity in any of these individual variables, by taking each of them as outcome in the RD analysis. The corresponding graphs and tables are included in online Appendix B, along with a more detailed description of the placebo variables. Overall, one coefficient out of 54 is significant at the 1 percent level, 3 are significant at the 5 percent level, and 4 at the 10 percent level.

We then conduct the following general test for imbalance. We regress the treatment variable *T* on these variables, use the coefficients from this regression to predict treatment status for each candidate, and test whether the predicted value jumps at the threshold. To avoid dropping observations, for each regressor, we include a dummy equal to one when the variable is missing and replace missing values by 0s. Figure 1 shows the lack of any jump at the cutoff for predicted assignment to first rank (instead of second), second rank (instead of third), and third rank (instead of fourth). In this graph as well as all the graphs showing the effects of rankings, each dot indicates the average value of the outcome within a certain bin of the running variable. Observations corresponding to higher-ranked candidates are on the right of the threshold, and those corresponding to lower-ranked ones are on the left. We fit a quadratic polynomial on each side of the threshold, to facilitate visualization. As shown in online Appendix Table A5, the coefficients are close to 0 and nonsignificant.

This general balance test makes us confident that there is no systematic sorting of candidates at the threshold. In addition, the results shown in the rest of the paper are robust in sign, magnitude, and statistical significance to controlling for all the baseline variables (see online Appendix Table C4).

<sup>&</sup>lt;sup>14</sup>Online Appendix Figure A3 plots the candidate's vote share in the first round against the running variable. We observe that in sample 1, the candidates ranked marginally first and second in the first round received around 30 percent of candidate votes at the threshold, on average. In sample 2 (respectively, 3), the first-round vote share of candidates ranked marginally second and third (respectively, third and fourth) was 20 percent (respectively, 18 percent) at the threshold.

<sup>&</sup>lt;sup>15</sup>We constructed this dummy variable based on the political labels attributed by the Ministry of the Interior (see online Appendix H).



FIGURE 1. GENERAL BALANCE TEST

*Notes:* Dots represent the local averages of the predicted treatment status (vertical axis). Averages are calculated within quantile-spaced bins of the running variable (horizontal axis). The running variable (the vote share difference between the two candidates in the first round) is measured as percentage points. The graph is truncated at 30 percentage points on the horizontal axis to accommodate for outliers. Continuous lines are a quadratic fit.

#### **II. Main Results**

#### A. Impact on Winning

We first measure the impact of candidates' first-round rankings on their unconditional likelihood to win the race: an outcome defined whether the candidate participates in the second round or not, and equal to 1 if the candidate wins, and 0 if she stays in the second round and loses or if she drops out between rounds.

Figure 2 plots two outcomes against the running variable, for each of the three discontinuities: the likelihood that the higher- and lower-ranked candidates stay in the second round, in blue, which we turn to in Section IIIB; and the likelihood that they win, in red.

We observe a clear jump in candidates' likelihood to win the race at the cutoff in the first plot: ranking 1vs2 in the first round has a large and positive impact on winning the second. The jump is even larger for the impact of ranking 2vs3 and it remains visible for the impact of ranking 3vs4, but it is smaller: very few candidates ranked third and fourth in the first round are in a position to win the second round, limiting the scope for impact.



FIGURE 2. IMPACT ON RUNNING IN THE SECOND ROUND AND WINNING

*Notes:* Triangles (respectively, circles) represent the local averages of the probability that the candidate runs (respectively, wins) in the second round (vertical axis). Averages are calculated within quantile-spaced bins of the running variable (horizontal axis). The running variable (the vote share difference between the two candidates in the first round) is measured as percentage points. The graph is truncated at 30 percentage points on the horizontal axis to accommodate for outliers. Continuous lines are a quadratic fit.

Table 2 presents the formal estimates. On average, ranking 1vs2 in the first round increases the likelihood to win the election by 5.8 percentage points (column 1), which represents a 12.7 percent increase compared to the average chance of victory of close-second candidates at the threshold. Ranking 2vs3 has an even larger effect, of 9.9 percentage points (column 2): it more than triples the likelihood of victory of close-third candidates. The effect of ranking 3vs4 is smaller in magnitude (2.2 percentage points, column 3), but it amounts to a fifth-fold increase compared to the very small fraction of races won by close-fourth candidates. The effects of ranking 1vs2 and 2vs3 are significant at the 1 percent level and the effect of ranking 3vs4 is significant at the 10 percent level.

To check the robustness of the results to alternative specifications and bandwidth choices, we estimate the treatment impacts using a quadratic specification (online Appendix Table C1), the optimal bandwidths computed according to Imbens and Kalyanaraman (2012) (online Appendix Table C2), tighter bandwidths obtained by dividing the MSERD bandwidths by 2 (online Appendix Table C3), and controlling for baseline variables (online Appendix Table C4). Online Appendix Figure C1 also shows the robustness of the effects to a large set of bandwidth choices, using both a polynomial of order 1 and 2. All these regressions use Calonico, Cattaneo, and Titiunik'ss (2014) estimation procedure. The corresponding estimates are very close

| Outcome                 | 1v                 | 1vs2             |                  | 2vs3             |                    | 3vs4                                    |  |
|-------------------------|--------------------|------------------|------------------|------------------|--------------------|---|--|
|                         | (sam               | (sample 1)       |                  | (sample 2)       |                    | (sample 3)                              |  |
|                         | <b>Run</b>         | Win              | Run              | Win              | Run                | Win                                     |  |
|                         | (1)                | (2)              | (3)              | (4)              | (5)                | (6)                                     |  |
| Treatment               | $0.056 \\ (0.005)$ | 0.058<br>(0.017) | 0.235<br>(0.018) | 0.099<br>(0.013) | $0.146 \\ (0.040)$ | 0.022<br>(0.011)                        |  |
| Robust <i>p</i> -value  | 0.000              | 0.004            | 0.000            | 0.000            | 0.003              | 0.052                                   |  |
| Observations left       | 12,272             | 8,027            | 5,347            | 4,398            | 1,169              | $1,116 \\ 1,116 \\ 1 \\ 0.033 \\ 0.005$ |  |
| Observations right      | 12,272             | 8,027            | 5,347            | 4,398            | 1,169              |   |  |
| Polynomial order        | 1                  | 1                | 1                | 1                | 1                  |   |  |
| Bandwidth               | 0.109              | 0.066            | 0.068            | 0.052            | 0.036              |   |  |
| Mean, left of threshold | 0.941              | 0.458            | 0.572            | 0.048            | 0.300              |   |  |

TABLE 2—IMPACT ON RUNNING IN THE SECOND ROUND AND WINNING

*Notes:* Standard errors, shown in parentheses, are clustered at the district level. We compute statistical significance based on the robust p-value. The unit of observation is the candidate. In columns 1, 3, and 5 (respectively, 2, 4, and 6), the outcome is a dummy equal to 1 if the candidate runs (respectively, wins) in the second round. The independent variable is a dummy equal to 1 if the candidate placed higher in the first round. We use local polynomial regressions: we fit separate polynomials of order 1 on each side of the threshold and compute the bandwidths according to the MSERD procedure. The mean, left of the threshold gives the value of the outcome for the lower-ranked candidate at the threshold.

in magnitude and they remain statistically significant. Finally, the effects of ranking 2vs3 are robust to excluding races in which the second candidate is less than 2 percentage points behind the first in the first round, and the effects of ranking 3vs4 to excluding races in which the third candidate is less than 2 or 4 percentage points behind the second (online Appendix Tables C6 and C7).<sup>16</sup> This indicates that our estimates are not driven by cases in which several vote share discontinuities overlap.

The effects of rankings on winning the race can result both from an increased likelihood to stay in the second round, as any qualifying candidate can decide to drop out, and from an increased likelihood to win the election conditional on staying in, if voters rally behind higher-ranked candidates. We now use our RDD framework to estimate the effects of rankings on both outcomes and disentangle these two channels. We also estimate the impact on vote shares conditional on staying in the race, to determine which fraction of the electorate drives the conditional impact on winning conditional on staying.

## B. Impact on Staying in the Race

In Figure 2, the quadratic polynomial fit for staying in the second round (in blue) indicates a large upward jump at the cutoff for ranking first instead of second (1vs2). The jump is even more dramatic for ranking 2vs3 and 3vs4, and in both cases it is larger than the discontinuity observed for winning.

<sup>&</sup>lt;sup>16</sup>The only exception is the effect of ranking 3vs4 on winning, which becomes close to 0 when considering races where the third candidate lags more than 4 percentage points behind the second. Indeed, in those races, third candidates have a very low vote share, by construction, which nearly eradicates their chances of winning: overall, they only win 14 out of 1,033 such races.

Consistent with the graphical analysis, the estimates reported in column 1 of Table 2 indicate that ranking 1vs2 increases qualifying candidates' likelihood to run in the second round by 5.6 percentage points (6.0 percent of the mean at the threshold on the left): while 5.9 percent of close-second candidates decide not to enter the second round, almost all first place candidates do (column 1). Ranking 2vs3 and 3vs4 have larger effects: they increase running in the second round by 23.5 percentage points (41.1 percent) and 14.6 percentage points (48.7 percent), respectively (columns 3 and 5). All three effects are significant at the 1 percent level.

Once again, these effects have a similar magnitude and remain statistically significant when using alternative specifications, bandwidths, or estimation procedures, and when excluding races with overlapping discontinuities (see online Appendix C).

The decision to stay in the race or drop out may come from candidates themselves. Staying in the second round requires time and effort, and suffering a defeat can be psychologically costly, so lower-ranked candidates may drop out more often simply because they expect to be more likely to lose. In addition, policy-motivated candidates may be willing to coordinate with each other to prevent the victory of a disliked opponent. However, there is also ample anecdotal evidence that political parties endorsing candidates often have a say in the decision whether or not to stay in the race, including in French elections (Pons and Tricaud 2018).

The effects of rankings on running in the second round could therefore reflect in part choices that were made by parties. We find some support for this view by comparing the effects on this outcome for candidates with and without party labels. As shown in online Appendix Table A6, effects of ranking 2vs3 on these two types of candidates are of similar magnitude, but ranking 1vs2 increases the likelihood of staying in by twice as much for party candidates as for non-affiliated candidates, and ranking 3vs4 by three times as much. Interestingly, online Appendix Table A7 shows that incumbents are less likely to drop out of the race as a result of having a lower rank in the first round, suggesting that they are more able to withstand outside pressure to do so, including from their party.<sup>17</sup> We discuss the role of parties and the motivations underlying their choices at greater length in Sections IVB through IVD.

## C. Impact on Winning and Vote Shares Conditional on Staying in the Race

We now turn to the second channel which might underlie the impacts of rankings on winning: an increased vote share and likelihood of winning *conditional on staying* in the second round, either because active voters rally behind higher-ranked candidates or because these candidates manage to mobilize a larger fraction of their supporters.

<sup>&</sup>lt;sup>17</sup> In online Appendix Tables A6 and A7, the samples are restricted to candidates with a specific characteristic (running under a party label or not, and being an incumbent or not). The number of candidates satisfying these criteria varies across races. Therefore, the regressions shown in these tables include different numbers of observations on the two sides of the threshold, unlike our main regressions using exactly two observations per race. In online Appendix Table A7, we define as incumbent any candidate who won a race in the same département in the last election. The results are robust to restricting the definition to candidates who won the last race in the exact same district (online Appendix Table A8). We do not show the effects of ranking 3vs4 separately for incumbents and non-incumbents because the number of incumbents among close-third and close-fourth candidates is very low.

*Bounds on the Conditional Effects of Rankings.*—To estimate these effects, we cannot simply run an RDD on elections in which both the lower- and higher-ranked candidates decide to remain in the second round. Indeed, the fact that close candidates qualifying for the second round are similar at the threshold does not imply that close candidates who decide to stay in the second round are similar as well.

To address this selection issue, we follow Anagol and Fujiwara (2016), who adapt Lee's (2009) bounds method to RDDs. To estimate the impact of ranking 1vs2 on the likelihood of winning conditional on staying in the race, we first decompose it mathematically into observed and unobserved components.

Using the potential outcomes framework, we define  $R_0$  and  $R_1$  as binary variables indicating if the candidate runs in the second round when T = 0 (the candidate ranked second in the first round) and T = 1 (the candidate ranked first), respectively. In the data, we only observe  $R = TR_1 + (1 - T)R_0$ : we know whether the candidate placed first decides to stay in the second round, but not whether she would have stayed if placed second, and conversely. Next, we define  $W_0$  and  $W_1$  as binary variables indicating if the candidate wins in the second round conditional on staying in when T = 0 and T = 1, respectively. We only observe  $W = R[TW_1 + (1 - T)W_0]$ : when the candidate does not stay in the second round (R = 0), she does not win (W = 0) and we do not observe whether she would have won if she had stayed in. When she runs in the second round (R = 1), we observe whether the candidate ranked first in the first round wins the election but not whether she would have won if ranked second, and conversely.

We further define four types of candidates: "always takers," who always run in the second round, whether they ranked first or second in the first round; "never takers," who never run in the second round; "compliers," who run in the second round if ranked first but not second; and "defiers," who run in the second round if ranked second but not first. To derive bounds, we assume that there are no defiers: all candidates who ranked second and stay in the second round would also have stayed if ranked first. Under this assumption, we have that  $R_1 \ge R_0$  and we can write the impact on the unconditional likelihood of winning (estimated in Section IIIA) as the sum of the impact on running in the second round (estimated in Section IIIB), multiplied by the likelihood that close-second-place compliers would win if they entered the race; and the impact on the likelihood of winning conditional on staying (for compliers and always takers), multiplied by the probability of staying of first-place candidates at the threshold:

(2) 
$$\underbrace{E[W_1R_1 - W_0R_0|x = 0]}_{RD \ effect \ on \ W} = \underbrace{\Pr(R_1 > R_0|x = 0)}_{RD \ effect \ on \ R} \cdot \underbrace{E[W_0|x = 0, R_1 > R_0]}_{Unobservable} \\ Effect \ on \ win \ cond \ on \ being \ always-taker \ or \ compliant \\ + \underbrace{E[W_1 - W_0|x = 0, R_1 = 1]}_{\lim_{x \downarrow 0} E[R|x]}$$

From this expression, we get:

(3)  

$$Effect on win cond on being always-taker or complier
$$E[W_1 - W_0 | x = 0, R_1 = 1]$$

$$= \left(\frac{1/E[R_1 | x = 0]}{\lim_{x \downarrow 0} E[R | x]}\right) \left\{ \frac{E[W_1 R_1 - W_0 R_0 | x = 0]}{RD \ effect \ on W} - \frac{\Pr(R_1 > R_0 | x = 0)}{RD \ effect \ on R} + \frac{E[W_0 | x = 0, R_1 > R_0]}{Unobservable} \right\}.$$$$

 $E[W_0|x = 0, R_1 > R_0]$  is the likelihood that close compliers would win if they remained in the race, absent treatment (i.e., when they rank second). By definition, compliers do not stay in when they rank second (but only when they rank first). This term is thus unobservable. Since all the other terms on the right-hand side of equation (3) are observed, we can derive bounds on the effect on winning conditional on staying in by making assumptions about this term.

To obtain an upper bound, we set  $E[W_0|x = 0, R_1 > R_0] = 0$ , as the largest possible effect of ranking 1vs2 on winning conditional on running occurs if we assume that close-second-ranked compliers would never win the second round if they decided to run. To obtain a lower bound, we replace the unobservable term by the probability that close-first-ranked candidates who do choose to stay in the race win the election: 51.8 percent. The choice of this high probability (which is higher than the probability of victory of close-second-ranked candidates who actually stay in, 48.6 percent) makes our lower bound conservative.

We use the same method to derive bounds on the impact of ranking 2vs3 (respectively, 3vs4) on the likelihood of winning conditional on staying in. The probability that close higher-ranked compliers win the election, which we use to replace the unobservable term when computing the lower bounds, is 18.3 percent (respectively, 6.1 percent), which is much higher than the probability of victory of close lower-ranked candidates who do stay in the second round: 8.5 percent (respectively, 1.8 percent).

To derive bounds on the effects on second-round vote shares conditional on staying in, we replace the effect on the unconditional likelihood of winning by the effect on unconditional vote shares (an outcome equal to 0 if the candidate drops out between rounds), in equation (3). This effect corresponds to the jumps observed on online Appendix Figure A4, which plots unconditional vote shares of the lower- and higher-ranked candidates against the running variable. In addition, to derive the lower bound 1vs2, we replace the unobservable term by the vote share obtained in the second round by close-first-ranked compliers: 48.6 percent. Again, we use the same method for 2vs3 and 3vs4. The second-round vote share of close higher-ranked compliers, which we use to compute their lower bounds, are 36.9 and 23.1 percent, respectively.

Finally, we use a bootstrapping procedure to estimate the standard errors of the bounds: we draw a sample from our districts with replacement, compute the lower and upper bounds as indicated above, repeat these two steps 10,000 times, and estimate the empirical standard deviation of both bounds.

Table 3 provides the resulting bounds and bootstrapped standard errors of the effects of ranking 1vs2, 2vs3, and 3vs4 on conditional vote shares and likelihood of winning.

As shown in column 1, conditional on running in the second round, ranking 1vs2 in the first round increases the likelihood of winning by 2.9 to 5.9 percentage points (6.0 to 12.1 percent of the mean for candidates ranked second who run in the second round at the threshold). The upper bound is significant at the 5 percent level, but the lower bound is not. The effect on vote share conditional on running is 1.3 to 4.0 percentage points, where both the upper and lower bounds are significant at the 1 percent level (column 2).

Ranking 2vs3 has larger effects, conditional on staying in the race. First, it increases the likelihood of winning by 6.9 to 12.2 percentage points, which roughly corresponds to a doubling of this outcome, compared to the mean at the threshold on the left (column 3). Second, it increases the conditional second-round vote share by 4.0 to 14.7 percentage points (column 4). The upper and lower bounds of both effects are significant at the 1 percent level.

Finally, ranking 3vs4 increases the conditional likelihood of winning by 3.0 to 5.0 percentage points, which corresponds to a three-fold or four-fold increase (column 5). The upper bound is significant at the 10 percent level, but not the lower bound. Ranking 3vs4 also increases the second-round vote share by 2.5 to 10.0 percentage points (12.8 to 51.0 percent), conditional on running, with the upper and lower bounds significant at the 1 and 5 percent level, respectively (column 6).

These results indicate that effects of rankings on winning and on vote shares are very unlikely to be fully explained by their impact on staying in the race. To corroborate this conclusion, we check which value of  $E[W_0|x = 0, R_1 > R_0]$ , the unobserved likelihood that close lower-ranked compliers would win if they stayed in, would make the effects of rankings conditional on running null or statistically nonsignificant. Setting conditional effects to 0 in equation (3) gives us the equality  $E[W_0|x = 0, R_1 > R_0] = E[W_1R_1 - W_0R_0|x = 0]/\Pr(R_1 > R_0|x = 0)$ , where the right-hand side is the ratio of rankings' effects on winning and on running. We report the corresponding point estimates in online Appendix Table A9, panel A.<sup>18</sup> They are well above the probability of winning and the vote share of close *lower*-ranked as well as close *higher*-ranked candidates who actually stay in the race.<sup>19</sup>

<sup>&</sup>lt;sup>18</sup>The standard errors shown in online Appendix Table A9, panel A are estimated using the same bootstrapping procedure as the one used to estimate the standard errors of the bounds in Table 3. Column 1 shows that the likelihood that close compliers would win if they remained in the race would need to be larger than one for the effect of ranking 1vs2 on winning conditional on staying in to be null, which is of course impossible. This comes from the fact that ranking 1vs2 has a smaller impact on running (5.6 pp) than on winning (5.8 pp). The former effect could therefore not explain the latter even if all close compliers always won if they stayed in the race.

<sup>&</sup>lt;sup>19</sup>The actual probability of winning and vote share of close lower-ranked candidates who stay in the race are, respectively, 48.6 and 47.3 percent (for ranking 1vs2), 8.5 and 31.1 percent (for ranking 2vs3), and 1.8 and 19.6

| Outcome                                       | 1<br>(sam  | vs2<br>nple 1)            | 2<br>(sam                 | vs3<br>nple 2)              | 3vs4<br>(sample 3)        |  |
|---|--|---------------------------|---------------------------|-----------------------------|---------------------------|--|
|   | Win<br>(1)   | Vote share (2)            | Win<br>(3)                | Vote share (4)              | Win<br>(5)                | Vote share<br>(6)  |
| Upper bound<br>Boot. std error<br>Lower bound | $\begin{array}{c} 0.059 \\ (0.024) \\ 0.029 \end{array}$ | 0.040<br>(0.004)<br>0.013 | 0.122<br>(0.018)<br>0.069 | 0.147<br>(0.013)<br>0.040   | 0.050<br>(0.026)<br>0.030 | $\begin{array}{c} 0.100 \\ (0.023) \\ 0.025 \end{array}$ |
| Boot. std error<br>Mean                       | (0.023)<br>(0.023)<br>0.486                              | (0.003)<br>(0.473)        | (0.015)<br>0.085          | (0.040)<br>(0.005)<br>0.311 | (0.020)<br>0.018          | (0.012)<br>0.196   |

TABLE 3—BOUNDS ON THE IMPACT ON WINNING AND VOTE SHARES, CONDITIONAL ON STAYING IN

*Note:* The mean, left of the threshold, gives the value of the outcome for the lower-ranked candidate at the threshold, conditional on running in the second round.

We then ask which assumptions we would need to make on  $E[W_0|x = 0, R_1 > R_0]$  for the conditional effects of rankings to be nonsignificant. Let us define  $\lambda$  as a variable equal to  $E[W_0|x = 0, R_1 > R_0]$ , so that the numerator on the right-hand side of equation (3) is equal to the impact of rankings on  $W - R\lambda$ . Then, the conditional effect of rankings, which is on the left-hand side of that equation, is non-significant if and only if the impact on  $W - R\lambda$  is nonsignificant. Online Appendix Table A9, panel B reports the lowest values of  $\lambda$  for which this is the case. For most outcomes and discontinuities, these values are again higher than the probability of winning and the vote share of lower- and higher-ranked candidates who stay in the race, close to the threshold.

In sum, one would need to assume that compliers would win with an implausibly high likelihood if they remained in the race and that they would obtain an implausibly high vote share for the conditional effects of rankings to be null or nonsignificant.

*Effects on Election Outcomes outside the Threshold.*—Since our effects are measured at the threshold, for elections in which the higher- and lower-ranked candidates obtained nearly identical vote shares in the first round, one may wonder whether voters also tend to rally behind higher-ranked candidates in races further away from the discontinuity. The RDD does not allow us to test this, by construction, but we do not see any clear reason to expect the contrary, especially since close races are descriptively similar to other races, as shown in online Appendix Tables A2 to A4.

Another possible concern is that the conditional effects we measure on *winning* may be artificially large because they are estimated in close races. To see this, imagine an election in which the top two candidates in the first round would obtain very close vote shares and finish first and second in the second round, absent effects of rankings. Then, even a modest effect of ranking 1vs2 on vote shares would translate into a large effect on winning. In a less close election, a vote share effect of the same magnitude would be much less likely to affect the outcome of the race.

However, it is important to note that the level of closeness in the first round is not a perfect predictor of second-round closeness. Indeed, the set of candidates present

percent (for ranking 3vs4). The winning probability and vote share of close higher-ranked candidates who stay in are, respectively, 51.8 and 48.6 percent; 18.3 and 36.9; and 6.1 and 23.1.

on the ballot and the pool of voters participating in each round are different. In addition, the same voter may cast different ballots in the two rounds. It follows that elections that are close in the first round may be less close in the second round, and vice versa. In the full sample, the correlation between closeness in the first and second rounds is far from perfect: the coefficient of correlation, computed using all races with more than one candidate in the second round, is equal to 0.55.

Furthermore, we provide direct evidence that our estimation strategy does not generate artificially large conditional effects on winning by estimating the fraction of races in which the distance between the second-round vote shares of the candidates who were first and second in the first round is smaller than the average effect of ranking 1vs2. We restrict our attention to races in which both top-two candidates competed in the second round. Online Appendix Table A10 presents results obtained when considering either the upper or lower bound of the effects of ranking 1vs2 on vote shares. Conservatively, we only discuss the results obtained with the lower bound, equal to 1.3 percentage points (Table 3). In the second round, the vote share of the first candidate was higher than the vote share of the second, but by a margin smaller than this lower bound in 3.1 percent of the races. The table also shows that this fraction is larger in elections that were close in the first round, as one would expect, but it remains important even for elections located more than 5 percentage points away from the threshold.

We repeat the same exercise for ranking 2vs3 and 3vs4, and find that the higher-ranked candidate finishes the race ahead of the lower-ranked one, but with a lead narrower than the lower bound of rankings' effects in 8.5 percent and 10.6 percent of the races, respectively. Once again, these fractions are smaller but remain substantial in races that were not close in the first round.

These results suggest that first-round placements affect the ordering of candidates in the second round and the identity of the winner in many races, including outside of the discontinuity. We do not compute the exact fraction of elections whose outcome changed as a result, since this would require disregarding possible variations in rankings' effects on voter behavior across different types of races. However, we reject the possibility that effects on vote shares measured at the threshold translated into artificially large effects on winning due to the focus on close first-round races.

Types of Voters Driving Rankings' Conditional Effects.—The effects of rankings on winning and on vote shares, conditional on candidates staying in the race, might be driven by different types of voters. Focusing on the impact of ranking 1vs2, we distinguish voters who cast a ballot for one of the top two candidates in the first round (type 1), those who voted for a candidate other than the top two (type 2), and nonvoters and people who voted blank or null (type 3). We exploit the fact that rankings are assigned at the district level and that the split of voters between these three groups varies within districts. If the first candidate gains an edge by stealing voters away from the second, then the effects of rankings should be relatively larger in parts of the district in which these two candidates received more votes in the first round. In contrast, if the first candidate attracts a disproportionate number of supporters of candidates other than the top two (including candidates eliminated after the first round), effects should increase with the fraction of such voters. Finally, ranking first instead of second may be consequential because it facilitates the mobilization of nonvoters. In that case, the effects of rankings should be larger in areas with a larger fraction of nonvoters.

We test these rival predictions using electoral results at the municipality or precinct level, depending on data availability. The average precinct (or municipality) counts 669 citizens, allowing us to study the behavior of relatively small groups of voters. We collected results for a total of 475,501 precincts. We first split all precincts within each district and race into terciles defined based on the fraction of type 1 voters, and compare effects on vote share across terciles. By construction, each race is equally represented in each tercile, facilitating the interpretation of the results: differences between terciles cannot result from differences across races. We then repeat the exercise by defining terciles based on the fraction of type 2 and type 3 voters. Online Appendix D includes additional details on these tests, and online Appendix Table D1 presents the results. The effects of rankings on vote share decrease with the fraction of nonvoters (columns 8 to 10) and increase with the fraction of people who voted for the top two candidates in the first round (columns 2 to 4). In both cases, the effects in the first and third terciles are significantly different from each other. The pattern is less clear for terciles defined based on the fraction of votes received by candidates other than the top two (columns 5 to 7). Overall, the results suggest that the effects of rankings on voter behavior do not solely or even primarily come from the differential mobilization of nonvoters, but that candidate rankings mainly influence the choice of active voters hesitating between the top two.

#### **III.** Mechanisms

Our main results indicate that the effects of first-round rankings on candidates' likelihood to win the second round are driven both by higher-ranked candidates' higher likelihood to stay in the race and by voters rallying behind them. These two effects may be linked: lower-ranked candidates' more frequent dropouts may reflect in part the (accurate) anticipation of being disadvantaged by their rank in the second round. To the extent that candidates adjust their decisions to their expectations about voter behavior, any mechanism affecting voters' response to rankings may help explain candidates' own response. Therefore, in this section, we discuss the mechanisms underlying the behavior of candidates and voters jointly.

# A. Impact Depending on the Difference between Candidates' Political Orientations

We first compare rankings' effect size when the higher- and lower-ranked candidates have the same political orientation versus distinct orientations.

As shown on Figure 3, the effects of rankings on staying in the second round and winning are much larger in races where candidates have the same orientation. When the first and second candidates have the same orientation, ranking 1vs2 increases the likelihood of staying in and winning by 35.2 and 30.5 percentage points, respectively. Both estimates are significant at the 1 percent level. By contrast, the effects are close to zero and nonsignificant when they have distinct orientations (online



FIGURE 3. IMPACT OF RANKINGS DEPENDING ON THE DIFFERENCE BETWEEN CANDIDATES' POLITICAL ORIENTATIONS

*Notes:* The three graphs on the left-hand side (respectively, right-hand side) consider only races where the two candidates have the same orientation (respectively, distinct orientations). Other notes as in Figure 2.

Appendix Table A11). We find a similar difference for ranking 2vs3: its effects on staying in the race and winning are, respectively, 62.7 and 22.3 percentage points, significant at the 1 percent level, when the second and third candidates have the same orientation. When they have distinct orientations, the effects remain significant at the 5 percent level but decrease to 5.2 and 4.1 percentage points (online Appendix Table A12). Finally, when the third and fourth candidates have the same orientation, the effect of ranking 3vs4 on staying in is 40.1 percentage points and significant at the 1 percent level, and the effect on winning 4.0 percentage points and

nonsignificant. Both point estimates are lower and nonsignificant when they have distinct orientations (online Appendix Table A13).

A possible interpretation is that the effects of rankings are driven by strategic coordination. Shared political orientation makes coordination more desirable: it increases the value that the two candidates, their parties, and their supporters place on defeating ideologically distant candidates. When two candidates have the same orientation, rankings may be used as a coordination device both by strategic voters, to coordinate on the same candidate, and by parties, to decide which candidate should drop out of the race.

However, other interpretations are possible. Shared orientation also makes it less costly for voters to rally behind the higher-ranked candidate, whatever their underlying motive is. Similarly, ideological proximity and the habit to govern together make it easier for sister parties to reach dropout agreements (Pons and Tricaud 2018). In doing so, their objective may not necessarily be to prevent the victory of a third candidate.

In the next two sections, we focus on the impact of ranking 1vs2 and consider separately races in which a third candidate qualifies or fails to qualify, to disentangle the role of coordination from other possible mechanisms.

## B. The Role of Coordination

To investigate the extent to which coordination explains the effects of ranking 1vs2, we focus on elections in which three or more candidates qualify for the second round. In these elections, the top two candidates and their supporters might want to coordinate against lower-ranked candidates and use rankings to do so. We conduct two distinct tests.

First, the top two candidates and their supporters should be more willing to coordinate when the candidate who came in third is stronger and more likely to challenge the victory of one of the top two. If coordination against the third candidate drives our results, we should thus expect the second candidate to be more likely to drop out of the race and voters to be more likely to rally behind the first when the third candidate's vote share is closer to the second's. Consistent with this prediction, Table 4 shows that the effects of ranking 1vs2 on entering the second round and winning are larger when the gap in first-round vote shares between the second and third candidates is below 5 percentage points than in the full sample (columns 1 to 4). Effect size further increases when the gap is narrower than 2.5 percentage points (columns 5 and 6). We observe the same patterns when we restrict the sample to races in which the top two candidates have the same orientation, making incentives to coordinate against the third candidate particularly strong (see online Appendix Table A14).

Second, the top two candidates and their supporters should be more likely to coordinate together (as opposed to coordinating with other candidates and groups of voters) when their ideological distance is relatively smaller than their distance with the third candidate. To the extent that our results are driven by coordination, we should expect the effects to be larger when the third candidate has a different orientation than both top two than when she has the same orientation, in races where the

| Outcome                 | 1vs2–3rd qualifies |            |            |                     |            |                       |  |
|-------------------------|--------------------|------------|------------|---------------------|------------|-----------------------|--|
|                         | F                  | Full       |            | Gap 2nd–3rd $< 5\%$ |            | Gap 2nd–3rd $< 2.5\%$ |  |
|                         | Run<br>(1)         | Win<br>(2) | Run<br>(3) | Win<br>(4)          | Run<br>(5) | Win<br>(6)            |  |
| Treatment               | 0.096              | 0.053      | 0.130      | 0.099               | 0.185      | 0.150                 |  |
| Robust <i>p</i> -value  | 0.000              | 0.119      | 0.000      | 0.062               | 0.000      | 0.011                 |  |
| Observations left       | 4,464              | 3,550      | 1,951      | 1,497               | 808        | 1,074                 |  |
| Observations right      | 4,464              | 3,550      | 1,951      | 1,497               | 808        | 1,074                 |  |
| Polynomial order        | 1                  | 1          | 1          | 1                   | 1          | 1                     |  |
| Bandwidth               | 0.086              | 0.065      | 0.090      | 0.066               | 0.064      | 0.089                 |  |
| Mean, left of threshold | 0.899              | 0.446      | 0.864      | 0.393               | 0.808      | 0.352                 |  |

TABLE 4—IMPACT OF RANKING 1VS2 DEPENDING ON THE STRENGTH OF THE THIRD

*Notes:* The sample only includes the races where the third candidate qualifies for the second round. In columns 3 and 4 (respectively, 5 and 6), the sample is further restricted to elections where the vote share difference between the candidates ranked second and third in the first round is under 5 (respectively, 2.5) percentage points. In columns 1, 3, and 5 (respectively, 2, 4, and 6), the outcome is a dummy equal to 1 if the candidate runs (respectively, wins) in the second round. Other notes as in Table 2.

top two candidates have the same political orientation. The results shown in online Appendix Table A15 are consistent with this prediction: ranking 1vs2 increases the likelihood of staying in the race by three times as much when the third candidate has a different orientation than when she has the same orientation (columns 3 and 5), and its effects on the likelihood of winning are only present in the former case (columns 4 and 6). When the top two candidates have distinct orientations, we should expect larger effects on staying in and winning when the third candidate is on the right or the left of both of them on the left-right axis than when she has the same orientation as one of them or is located in between. Support for this prediction is weaker, as none of these effects are statistically significant (online Appendix Table A16).

Overall, the heterogeneity of effect size in races where three or more candidates qualify for the second round supports the interpretation that strategic coordination by candidates and voters explains at least part of the effects of ranking 1vs2. To test whether it can explain them entirely, we now turn to races in which the third candidate does *not* qualify for the second round (races of sample 1 where the third candidate received a vote share below the qualification threshold in the first round).

## C. Party Norms and the Bandwagon Effect

When the third candidate does not qualify for the second round, there is not the need—or even the possibility—for the top two candidates and their voters to coordinate against a lower-ranked candidate. Nonetheless, as shown in Table 5, ranking 1vs2 increases a candidate's likelihood of winning by 5.9 percentage points overall (column 4), which is significant at the 5 percent level. Incidentally, the magnitude of this effect is almost exactly the same size as the point estimate in the full sample (Table 2). This effect is present but slightly smaller and at the limit of statistical significance when the first and second candidates have distinct orientations (*p*-value 0.103), and it is much larger (16.4 percentage points) and significant at the 5 percent level when their orientation is the same (columns 5 and 6).

| Outcome                 | 1vs2–3rd does not qualify |                         |              |                  |                         |                  |  |
|-------------------------|---------------------------|-------------------------|--------------|------------------|-------------------------|------------------|--|
|                         | Prob                      | Probability to run 1vs2 |              |                  | Probability to win 1vs2 |                  |  |
|                         | Full<br>(1)               | Same<br>(2)             | Distinct (3) | Full<br>(4)      | Same<br>(5)             | Distinct<br>(6)  |  |
| Treatment               | 0.018<br>(0.004)          | 0.186<br>(0.031)        | -0.000       | 0.059<br>(0.021) | 0.164                   | 0.049<br>(0.022) |  |
| Robust <i>p</i> -value  | 0.000                     | 0.000                   | 0.270        | 0.031            | 0.022                   | 0.103            |  |
| Observations left       | 7,554                     | 767                     | 3,133        | 5,130            | 652                     | 4,791            |  |
| Observations right      | 7,554                     | 767                     | 3,133        | 5,130            | 652                     | 4,791            |  |
| Polynomial order        | 1                         | 1                       | 1            | 1                | 1                       | 1                |  |
| Bandwidth               | 0.122                     | 0.127                   | 0.051        | 0.078            | 0.106                   | 0.081            |  |
| Mean, left of threshold | 0.982                     | 0.814                   | 1.000        | 0.471            | 0.418                   | 0.476            |  |

TABLE 5—IMPACT OF RANKING 1VS2 IN RACES WHERE THE THIRD DOES NOT QUALIFY

*Notes:* The sample only includes the races where the third candidate does not qualify for the second round. In columns 2 and 5 (respectively, 3 and 6), the sample is further restricted to elections where the two candidates have the same orientation (respectively, distinct orientations). In columns 1, 2, and 3 (respectively, 4, 5, and 6), the outcome is a dummy equal to 1 if the candidate runs (respectively, wins) in the second round. Other notes as in Table 2.

Party Norms.—In this configuration too—when the third candidate does not qualify for the second round—effects on winning are partly driven by effects on running in the second round. When the top two candidates have distinct orientations, none of them drop out between rounds at the threshold, and the effect on running is null (column 3). In contrast, when the top two candidates have the same orientation, the first candidate almost always stays in the second round, but the second drops out in 18.6 percent of the races at the threshold, a difference significant at the 1 percent level (column 2).

This result is puzzling: absent a third candidate, a dropout by one of the top two candidates means the race will be uncontested and won with certainty by the only remaining candidate. In this case, the benefit of dropping out is far from obvious, and the cost seems high. As shown in online Appendix Table A17, the second candidate drops out only rarely when the top two candidates are on the right, but very frequently when they are on the left. In that case, the choice to drop out often stems from agreements between left-wing parties, which contend that they want to follow the first-round choice of their supporters instead of allowing the supporters of candidates eliminated after the first round to decide the outcome of the race between the two remaining candidates. Complementary explanations for dropouts when the top two candidates have the same orientation and the third is absent include avoiding a campaign where negative arguments could hurt the reputation of both competitors, and enforcing regional or national agreements that allocate a certain number of seats to each of the allied parties. Indeed, in areas where they are enforced, dropout agreements ensure that roughly half of the races are won by the candidates of either of the competing parties at the threshold.

*Bandwagon Effect.*—To test whether voters respond to the first-round rankings of the top two candidates as well in races where the third candidate does not qualify for the second round, Table 6 derives bounds for the effects on winning and on vote share conditional on staying in. We find that ranking 1vs2 increases

| Outcome                       | come 1vs2–3rd does not qualify |             |                 |             |             |                 |
|-------------------------------|--------------------------------|-------------|-----------------|-------------|-------------|-----------------|
|                               |                                | Win         |                 |             |             |                 |
|                               | Full<br>(1)                    | Same<br>(2) | Distinct<br>(3) | Full<br>(4) | Same<br>(5) | Distinct<br>(6) |
| Upper bound                   | 0.059                          | 0.164       | 0.049           | 0.019       | 0.186       | 0.002           |
| Boot. std error               | (0.029)                        | (0.091)     | (0.029)         | (0.004)     | (0.035)     | (0.003)         |
| Lower bound<br>Poot atd arror | (0.049)                        | (0.030)     | (0.020)         | (0.010)     | (0.015)     | (0.002)         |
| Mean                          | 0.480                          | 0.526       | 0.476           | 0.500       | 0.500       | 0.499           |

TABLE 6—BOUNDS ON THE IMPACT OF RANKING 1vs2, CONDITIONAL ON RUNNING, IN RACES WHERE THE THIRD DOES NOT QUALIFY

*Notes:* The mean, left of the threshold, gives the value of the outcome for the lower-ranked candidate at the threshold, conditional on running in the second round. In columns 2 and 5 (respectively, 3 and 6), the sample is restricted to elections where the two candidates have the same orientation (respectively, distinct orientations).

candidates' conditional likelihood of winning by 4.9 to 5.9 percentage points overall (column 1). The lower and upper bounds are significant at the 10 and 5 percent levels, respectively. In these races, the behavior of voters moved by rankings cannot be explained by the desire to coordinate against lower-ranked candidates (who, again, are not present).

The most likely interpretation is that these voters get on the bandwagon because they derive intrinsic value from siding with the winner of the first round, or that they desire to vote for the winner of the race (Callander 2007, 2008) and anticipate that the candidate ranked first in the first round has increased chances of also winning the second. To see where this belief might originate, note that any voter who rallies behind the first candidate based on the expectation that she is more likely to win the race contributes to fulfilling this expectation. Therefore, this expectation may be part of an equilibrium in which voters desiring to be on the winning side use first-round rankings as a device to rally behind the same candidate. Voters may also arrive at that expectation in another way—for instance, by drawing inferences from the outcomes of previous races. Whatever their exact reasoning is, voters who rally behind the candidate ranked first in the first round because they desire to vote for the winner of the election are behaving rationally, even if that candidate's vote share margin in the first round was close to null and they know it. Indeed, as our paper shows, that candidate is more likely to win even such races.

The fraction of voters whose choice of candidate is based on this desire to be on the winning side is relatively small on average: the effect on vote share is between 1.0 and 1.9 percentage points (column 4), where both the lower and upper bounds are significant at the 1 percent level. Yet, this fraction is sufficient to sway a large share of close elections.

We observe an effect on winning conditional on staying in the race not only when the top two candidates have the same orientation (column 2) but also when they have distinct orientations (column 3). This result indicates that the bandwagon effect impacts electoral outcomes in a substantial number of races, even when the ideological distance between candidates is important. However, the lower and upper bounds on the effects on vote share are small and nonsignificant in that case (column 6). In contrast, the conditional effect on vote share is very large when both candidates have the same orientation, with lower and upper bounds of 7.5 and 18.6 percentage points, respectively, both significant at the 1 percent level (column 5).

Social Learning.—A complementary interpretation for the effect of ranking first on voter behavior is that preferences include a common value component and voters update their beliefs on candidate quality based on the choices of others. Knight and Schiff (2010) and Deltas et al. (2016) have shown in the context of US presidential primaries that voters learn from past vote shares and adjust their choice accordingly. So it may seem natural to assume that voters also learn from past candidate rankings.

We find this interpretation less plausible, for two reasons. First, while the bandwagon mechanism can be at play even with perfectly informed and rational voters, as discussed above, the social learning interpretation requires myopic voters. Indeed, our effects are estimated at the threshold where the first and second candidates received nearly identical vote shares in the first round and their placements do not contain any additional information on the private signals of other voters. For social learning to explain our effects, we would thus need to assume that voters lack information on vote shares, leading them to use rankings as a heuristic and to wrongly believe that the first candidate received substantially more votes. However, information on vote shares is readily available in the week separating the two rounds: as shown in Section IVD below, the media tend not to stop at simply reporting candidate rankings but also provide detailed information on race closeness. It is of course possible that voters fail to pay attention to this information, but if anything, one could expect it to be less likely to go unnoticed when the race is very close.

Second, to assess the actual explanatory power of the social learning interpretation, we test the following prediction. If voters use candidates' placements to learn about their quality, obtaining a higher rank should have lower effects for candidates who voters already know and on whom their priors should therefore be more precise, including incumbents and candidates who competed in the previous election. In online Appendix Table A18, we compare the effects of ranking 1vs2 for candidates present versus absent in the last election. The magnitude of the effect on winning and of its bounds, conditional on staying in, is similar for both types of candidates and, if anything, slightly larger for those who were present. As shown in online Appendix Table A20, effects on winning and their bounds are also very similar for incumbent and nonincumbent candidates. We obtain qualitatively identical results for the heterogeneous effect of ranking 2vs3 (columns 4 to 6 in online Appendix Tables A18 and A20) and 3vs4 (columns 7 to 9 in online Appendix Table A18).<sup>20</sup>

<sup>&</sup>lt;sup>20</sup>The number of candidates of a certain type varies across races. Therefore, the regressions shown in Tables A18 and A20 include different numbers of observations on the two sides of the threshold. In Table A18, we consider that the candidate competed in the previous election if she competed in any race in the département. In Table A20, we define as incumbent any candidate who won a race in the same département in the last election. The results are robust to restricting these definitions to candidates who competed in the last race in the exact same district or candidates who won in the exact same district or candidates who won in the exact same district or candidates who won in the exact same district or candidates who won in the exact same district of ranking 3vs4 separately for incumbents and nonincumbents (in Tables A20 and A21), because the number of incumbents among close-third and close-fourth candidates is very low. We do not show the effects of ranking 3vs4 separately for candidates who competed in the last race in the exact same district versus others (in Table A19), because the number of nonmissing observations is too low and the standard errors of the bounds cannot be computed.

Because these tests are indirect, they do not suffice to rule out the possibility that social learning contributes to the effects of rankings, but they do suggest that its explanatory power is limited.

## D. Alternative Mechanisms

So far, we have attributed the effects of rankings on a candidate's likelihood of winning and on their vote shares conditional on running to choices made solely by voters. We now discuss three alternative factors which could also explain these effects.

*Campaign Expenditures and Contributions.*—First, we examine whether these effects might be driven by campaign choices made by the higher- and lower-ranked candidates between the first and second rounds.<sup>21</sup>

We collected systematic data on candidates' campaign expenditures for all elections since 1992, the year in which the French National Commission on Campaign Accounts and Political Financing (CNCCFP) started recording them systematically.<sup>22</sup> We do not know the amount of money spent by candidates between rounds separately, only the total amounts of money they received and spent over the entire course of the campaigns. We measure the impact of rankings on these two outcomes divided by the number of registered citizens in the district. The effects, shown in online Appendix Table A22, are small overall and nonsignificant, even though higher-ranked candidates are more likely to run in the second round. The lack of systematic impact of rankings on total campaign expenditures and contributions is perhaps not very surprising since the first and second rounds are separated by only one week. We conclude that candidates' rankings do not affect their campaign efforts.

*Press Analysis.*—Second, voters may rally behind higher-ranked candidates as a result of larger or more positive coverage of these candidates by the media. Journalists may cover higher-ranked candidates more of their own volition, or in response to these candidates putting more effort to gain visibility. To test for differential media coverage, we used Factiva's research tool (Dow Jones & Company 1997–2017) and collected all newspaper articles released between the two rounds of all local and parliamentary elections since 1997 and covering the elections. These

<sup>&</sup>lt;sup>21</sup> Denter and Sisak (2015) show that campaign spending may strategically respond to past results—for instance, from polls—and there is comprehensive evidence that higher expenditures and advertising can increase vote shares (e.g., da Silveira and de Mello 2011; Spenkuch and Toniatti 2018; Bekkouche, Cage, and Dewitt 2022).
<sup>22</sup> All data come from the CNCCFP (1992–2017). Data on campaign expenditures for recent years are avail-

<sup>&</sup>lt;sup>22</sup> All data come from the CNCCFP (1992–2017). Data on campaign expenditures for recent years are available in a digital format on the Commission's website (http://www.cnccfp.fr/index.php?art=584). We collected and digitized the data for the 1992, 1994, 1998, 2001, and 2004 local elections. Data on campaign expenditures for the 1993, 1997, and 2002 parliamentary elections were collected and digitized by Fauvelle-Aymar and François (2005) and Foucault and François (2005), and shared with us by these authors. Data are only available for cantons above the 9,000 inhabitants threshold in local elections. In the 2012 and 2017 parliamentary elections and in the 2015 local elections, data are missing for candidates who received less than 1 percent of the candidate votes in the first round and did not receive any donation (as they were not required to submit their campaign accounts), but they are always available for all candidates qualifying for the second round.

elections account for 51.2 percent of our sample.<sup>23</sup> We obtain a total of 76,679 articles (more information on the selection of articles and the methods used to derive the results is available in online Appendix E).

We first measure the impact of ranking 1vs2, 2vs3, or 3vs4 on three different outcomes: the total number of articles mentioning the candidate's first and last names at least once, the total number of mentions (counting twice the articles in which the candidate is mentioned twice, thrice the articles in which they are mentioned thrice, etc.), and the total number of articles mentioning the candidate in the title. As shown in online Appendix Table E2, ranking 1vs2, 2vs3, or 3vs4 does not have any significant effect on any of these outcomes. Online Appendix Figure E1 corroborates this conclusion. As one would expect, the number of articles mentioning a candidate increases with the running variable, meaning that candidates with higher vote shares are cited more often. However, this outcome does not jump at any of the three discontinuities.

We complement this quantitative analysis with a more qualitative approach, to check if there is any difference between the actual content of newspaper articles on higher- and lower-ranked candidates. We read and annotated manually the full text of a random selection of 517 articles covering races with a vote share difference of less than 2 percentage points between the 2 candidates of the discontinuity, and citing at least 1 of them. The results of this analysis are presented in online Appendix Table E3, column 1. We find that newspaper articles are equally likely to be centered on the higher- and lower-ranked candidates and to include quotes or report the vote share of either candidate. Furthermore, the fraction of articles mentioning support of a public figure for the candidates, positive expectations by the candidates about their likelihood to win the election, or positive expectations by someone else are very similar for both candidates. We obtain similar results when focusing on articles covering even closer races (with a first-round vote share difference of less than 1 percentage point) and those covering the top two candidates (columns 2 and 3).

In addition to giving equal coverage to the higher- and lower-ranked candidates, we find that newspaper articles citing first-round results generally report candidates' vote shares, not just their ranking. Less than 10 percent of articles indicate rankings alone. Out of all articles reporting electoral results, 80 percent also (or only) mention the vote shares of candidates, the gap between them, or the closeness of the election. This proportion is even higher in particularly close races (83 percent) and when focusing on the top two candidates (82 percent).

In sum, newspaper articles do not cover higher-ranked candidates more often or more favorably, and they rarely draw readers' attention to their placement, making media coverage unlikely to explain the effects of rankings on vote shares and winning, conditional on staying in the race.

<sup>&</sup>lt;sup>23</sup> Press articles are only available on Factiva from the end of the 1990s onward. The number of newspapers covered and the total number of articles are much lower in the earlier years. Since a disproportionate fraction of races of sample 3, used to measure the impact of ranking 3vs4, come from these earlier elections, the average number of citations for these candidates is very low.

Dropout Decisions of Lower-Ranked Candidates.—Third, we check whether the effects might be driven by choices made by a third political actor, different from voters and the higher- and lower-ranked candidates: other candidates qualifying for the second round. The decision of these candidates to stay in the race or drop out between rounds might depend on the rankings of top candidates, and it might in turn affect the higher- and lower-ranked candidates' vote shares and likelihood of winning. For instance, if third candidates are more likely to drop out of the race when the candidate ideologically closest to them among the top two is ranked first than they are when she is ranked second, then that candidate should receive more votes by the third candidate's supporters when ranked first.

To examine this mechanism in a systematic way, we define two outcomes at the candidate level: a dummy equal to 1 if a lower-ranked candidate of the same orientation is present in the second round, and the number of such candidates. Both outcomes directly reflect dropout decisions of lower-ranked candidates. For ranking 1vs2 (respectively, 2vs3 and 3vs4), we consider candidates ranked third and below (respectively, fourth and below, and fifth and below).

The effects are shown in online Appendix Tables A23, A24, and A25: ranking 1vs2, 2vs3, or 3vs4 does not have any significant effect on the presence of lower-ranked candidates of the same orientation in the second round (columns 1 and 3). We test the robustness of this result in the subsample of races in which such effects are most likely to occur: races where the two candidates of interest have distinct political orientations and where at least one lower-ranked candidate qualifies (columns 2 and 4 of each table). Again, we do not find any significant impact.

We conclude that rankings' effects on electoral outcomes are driven neither by differential campaign expenditures nor by differential press coverage nor by dropout decisions of other candidates.

## **IV. External Validity**

#### A. Within France

To assess the external validity of our findings, we first check whether the effects of ranking 1vs2, 2vs3, and 3vs4 are specific to certain contexts within French elections. We do not find any evidence that this might be the case: rankings matter in both local and parliamentary elections, their effects are as large in recent elections as in previous decades, and they affect the likelihood to stay in the second round and win it for candidates on both the left and the right. All tables and figures presenting these results are in online Appendix F.

Local and parliamentary elections differ on many dimensions. Parliamentary elections are much more salient: their average district size is more than five times as large, they feature more candidates (9.1 against 5.5, on average, in the first round), and they are characterized by higher turnout, as shown in online Appendix Table F1. The latter difference implies that voters participating in local elections are likely to be more interested in and informed about politics on average. Yet, as shown in online Appendix Tables F2 and F3, the effects of rankings on staying in the race are of very similar size in both types of elections. Effects on winning are larger in

parliamentary elections for ranking 1vs2 and in local elections for ranking 3vs4, but they are similar in both types of elections for ranking 2vs3.

Our sample spans nearly 60 years, starting with the 1958 parliamentary elections. Changes in the French party system have been many since then, including the slow demise of the Communist Party, the creation of the far-right Front National and of the Green Party in the 1970s and 1980s, and the consolidation of each of these two parties in the last decades. The overwhelming victory of candidates affiliated with Emmanuel Macron's new centrist party En Marche at the 2017 parliamentary elections is the latest significant change in this political landscape. Online Appendix Figure F1 shows the impact of ranking 1vs2 and 2vs3 on winning in four distinct time periods, each including approximately 25 percent of the elections in the sample.<sup>24</sup> Despite all the aforementioned changes, rankings' effects have been remarkably stable over time.

Finally, we check whether the effects vary across political orientations. We measure effects on running and winning separately for candidates on the left and right, which collectively account for 81.6, 76.8, and 62.6 percent, respectively, of the observations used to measure the effects of ranking 1vs2, 2vs3, and 3vs4. As shown in online Appendix Tables F4 and F5, effects in these subsamples lose a bit of statistical significance, but overall they are substantial for both orientations. Effects on winning are larger for left-wing candidates when ranking 1vs2, for right-wing candidates when ranking 3vs4, and of similar magnitude for candidates of both orientations when ranking 2vs3.

#### B. Beyond France

We now assess the validity of our results beyond France by turning to the analysis of two-round elections in other countries.

*Data.*—We systematically collected data for all parliamentary elections around the world using a two-round plurality rule, in which the set of eligible voters is identical in both rounds and the set of candidates present in the second round is a subset of those present in the first. We identified these elections using the National Elections across Democracy and Autocracy (NELDA) database (Hyde and Marinov 2012), the Constituency-Level Elections Archive (CLEA) (Kollman et al. 2018), and the ACE Electoral Knowledge Network (2018).

We then collected all available election results at the constituency level, using the following sources: CLEA (Kollman et al. 2018); Psephos, Adam Carr's Election Archive (Carr 1999–2022); the Election Passport dataset (Lublin 2015–2016); and electoral commissions' websites (see online Appendix G1 for a detailed list of all the sources used to identify and collect two-round electoral results). We recorded district identifiers, candidates' names and parties, and, for both rounds, the number

<sup>&</sup>lt;sup>24</sup>We cannot show the same split by time period for the impact of ranking 3vs4, because the sample size is too small for this discontinuity, and most races in which four candidates qualify for the second round occurred in the early elections in the sample, when the qualification threshold was relatively lower.

of registered citizens, voters, null and blank votes, total candidate votes, and votes obtained by each candidate.

Of all countries that have ever used a two-round plurality voting rule to elect their upper or lower branch of parliament, we found results for 72 elections in 19 countries, corresponding to a total of 4,075 races with 2 rounds (see online Appendix Table G1.1 for the breakdown by country, election type, and year). The median time span between rounds is 14 days. Our sample covers elections from 1850 to 2018 in nearly all regions of the world: the Caribbean (Haiti), Western Africa (Mali, Mauritania), Eastern Africa (Comoros), Eastern Europe (Czech Republic, Hungary, Poland), Northern Europe (Norway, Lithuania), Southern Europe (Albania, Croatia), Western Europe (Belgium, Germany, the Netherlands, Switzerland), Western Asia (Bahrain, Georgia), and Oceania (Kiribati, New Zealand).

More than two candidates qualified for the second round in 19.5 percent of the races, enabling us to measure the impact of ranking both 1vs2 and 2vs3. In contrast, the number of races in which more than three candidates qualified is too small to estimate the impact of ranking 3vs4 in this sample. We outline the specific electoral rule used in each country in online Appendix Table G1.2 and report descriptive statistics in online Appendix Tables G2.1, G2.2, and G2.3 as well as placebo tests, general balance tests, and McCrary tests in online Appendix Tables G3.1 and G3.2, Figure G3.1 and Table G3.3, and Figure G3.2, respectively.

For all its merits, this sample has two main limitations, explaining why we do not use it for our main analysis, only to assess the external validity of our results. First, it has about five times fewer observations than our sample of French elections (4,075 against 22,557), which decreases statistical precision and limits our ability to conduct heterogeneity analysis.<sup>25</sup> Second, candidates' political party is either unknown or impossible to locate on the left-right axis for 32.1 percent of candidates, resulting in 64.6 percent of races in which the political orientation of one or more candidates cannot be pinpointed. This further prevents us from exploring the mechanisms underlying rankings' effects as conclusively as in the French data. We only use political party information for the placebo checks reported in online Appendix G3 for the subset of candidates for which this information is available.

*Main Results.*—Figure 4 replicates Figure 2: we plot second-round outcomes against the running variable for ranking 1vs2 and 2vs3. We observe large upward jumps in the likelihood of winning at both thresholds and smaller jumps in the likelihood of staying in the race. Consistent with the graphical analysis, the estimates reported in Table 7 indicate that ranking 1vs2 and 2vs3 have positive but not statistically significant effects on candidates' likelihood to run in the second round (1.0 and 8.2 percentage points, respectively). The effects on winning are larger and significant at the 5 or 10 percent level: 7.6 percentage points for ranking 1vs2 and 15.8 for ranking 2vs3. These results are robust to using alternative specifications

<sup>&</sup>lt;sup>25</sup> The difference in sample size comes from the fact that parliamentary elections in other countries include far fewer constituencies (and races) on average than they do in France; for some of these elections, we were only able to obtain results for a subset of the races, and we did not collect results of local elections outside of France.



FIGURE 4. IMPACT ON RUNNING IN THE SECOND ROUND AND WINNING BEYOND FRANCE

*Notes:* Triangles (respectively, circles) represent the local averages of the probability that the candidate runs (respectively, wins) in the second round (vertical axis). The graph is truncated at 50 percentage points on the horizontal axis to accommodate for outliers. Other notes as in Figure 2.

|                         | 11         | /s2              | 2v         | 2vs3       |  |
|-------------------------|------------|------------------|------------|------------|--|
| Outcome                 | Run<br>(1) | Win<br>(2)       | Run<br>(3) | Win<br>(4) |  |
| Treatment               | 0.010      | 0.076<br>(0.024) | 0.082      | 0.158      |  |
| Robust <i>p</i> -value  | 0.140      | 0.012            | 0.271      | 0.069      |  |
| Observations left       | 2,589      | 3,200            | 295        | 307        |  |
| Observations right      | 2,589      | 3,200            | 295        | 307        |  |
| Polynomial order        | 1          | 1                | 1          | 1          |  |
| Bandwidth               | 0.118      | 0.162            | 0.119      | 0.123      |  |
| Mean, left of threshold | 0.983      | 0.459            | 0.837      | 0.074      |  |

TABLE 7—IMPACT ON RUNNING IN THE SECOND ROUND AND WINNING BEYOND FRANCE

*Notes:* In columns 1, 3, and 5 (respectively, 2, 4, and 6), the outcome is a dummy equal to 1 if the candidate runs (respectively, wins) in the second round. Other notes as in Table 2.

and bandwidths, as well as excluding races with inconsistent results (see online Appendix G5).

Out of the seven countries for which sufficiently large samples make independent analysis possible, effects on winning are large and positive in five countries, and statistically significant in three of them, despite limited statistical power: the Czech Republic, Norway, and Poland (online Appendix Figure G6.1 and Table G6.1). Interestingly, the overall effects on running are smaller than in French elections, but the effects on winning larger, suggesting that voter choice contributes relatively more to rankings' effects in other countries and candidate choice relatively less.

*Mechanisms.*—We replicate some of the tests shown in Section IV to investigate the underlying mechanisms. To study strategic coordination, we focus again on races in which three or more candidates qualify for the second round. As in Table 4, Table 8 shows that the effects of ranking 1vs2 on entering the second round and

|   |                     | 1vs2–3rd qualifies  |                     |                     |                     |                     |  |  |
|---|---------------------|---------------------|---------------------|---------------------|---------------------|---------------------|--|--|
|   | Fi                  | ull                 | Gap 2nd-            | 3rd < 5%            | Gap 2nd-3           | rd < 2.5%           |  |  |
| Outcome                                       | Run                 | Win                 | Run                 | Win                 | Run                 | Win                 |  |  |
|   | (1)                 | (2)                 | (3)                 | (4)                 | (5)                 | (6)                 |  |  |
| Treatment                                     | 0.018 (0.023)       | 0.041 (0.063)       | 0.251 (0.202)       | 0.600               | 0.162               | 0.616 (0.423)       |  |  |
| Robust p-value                                | 0.442               | 0.859               | 0.235               | 0.040               | 0.418               | 0.133               |  |  |
| Observations left<br>Observations right       | 571<br>571          | 506<br>506          | 48<br>48            | 47<br>47            | 31<br>31            | 26<br>26            |  |  |
| Polynomial order<br>Bandwidth<br>Outcome mean | 1<br>0.126<br>0.955 | 1<br>0.110<br>0.469 | 1<br>0.081<br>0.749 | 1<br>0.080<br>0.209 | 1<br>0.101<br>0.838 | 1<br>0.076<br>0.199 |  |  |

TABLE 8—IMPACT OF RANKING 1VS2 DEPENDING ON THE STRENGTH OF THE THIRD BEYOND FRANCE

Note: Same notes as in Table 4.

| FABLE 9—IMPACT OF RANK | ing 1vs2 in | N RACES V | Where | the Third | DOES |
|------------------------|-------------|-----------|-------|-----------|------|
| Not Q                  | UALIFY BEY  | 'OND FRA  | NCE   |           |      |

|                         | Run<br>(1) | Win<br>(2) |
|-------------------------|------------|------------|
| Treatment               | 0.008      | 0.073      |
|                         | (0.005)    | (0.026)    |
| Robust <i>p</i> -value  | 0.146      | 0.008      |
| Observations left       | 1,941      | 2,674      |
| Observations right      | 1,941      | 2,674      |
| Polynomial order        | 1          | 1          |
| Bandwidth               | 0.110      | 0.177      |
| Mean, left of threshold | 0.988      | 0.462      |

Note: Same notes as in Table 5.

winning are larger when the gap in first-round vote shares between the second and third candidates is below 5 or 2.5 percentage points.

We then turn to races in which the third candidate does not qualify for the second round. As shown in Table 9, ranking 1vs2 increases candidates' likelihood of winning by 7.3 percentage points in these races, which is significant at the 5 percent level and close to the point estimate in the full sample. Similarly as in French elections (Table 5), these results indicate that strategic coordination explains part, but not all, of the effects of rankings and that mechanisms other than coordination, such as the bandwagon effect, contribute in other countries as well.

## V. Conclusion

This paper shows that candidate rankings in past contests have large effects on future electoral outcomes, and it uncovers the mechanisms by which rankings shape voters' and candidates' behavior.

Using a RDD in French two-round parliamentary and local elections since 1958, we find that placing first rather than second in the first round increases a candidate's likelihood to stay in the second round by 5.6 percentage points, and coming in second

rather than third and in third rather than fourth increases such likelihood even more. Higher-ranked candidates also obtain a larger vote share, and they are more likely to win, conditional on staying in. These conditional effects only reflect choices made by voters: they do not result from differences in campaign expenditures, press coverage, or dropout decisions by other qualifying candidates. Overall, the combined response of candidates and voters to rankings generates large effects on a candidate's likelihood to win (of 5.8, 9.9, and 2.2 percentage points, respectively).

Remarkably, we observe effects of similar magnitude in local and parliamentary elections, which vary in salience, and from 1958 to today, despite the many changes in the French party system since the beginning of the Fifth Republic. These results also hold beyond the French context: placing first and second have even larger effects on average in our sample of elections in 19 other countries.

The effects of ranking first are larger when the third candidate is more likely to challenge the top two candidates and when the top two candidates have the same political orientation, suggesting that coordination by parties and voters against other candidates qualified for the second round drives part of the effects. These results first indicate that rankings help strategic voters focus on the same subset of candidates-and do so in a decentralized way that requires no organizing or communicating. This is an important result given that multiple strategic equilibria usually exist when there are three or more candidates (Myerson and Weber 1993). Second, rankings also facilitate coordination among parties, leading to a decrease in the number of candidates. This result bridges a gap in the literature on the selection of elected officials, which to date has offered little rigorous evidence on the strategies of political parties and candidates and has mostly focused on voter choice. The effects of rankings on parties are at least as important as on strategic voters, given the propensity of many people to vote expressively when choosing between more than two candidates, raising the risk of suboptimal electoral outcomes such as a defeat of the Condorcet winner (Pons and Tricaud 2018). Dropout agreements based on rankings can help address this issue and increase the representativeness of elected leaders by reducing the number of alternatives. They offer a partial solution to Arrow's (1951)impossibility theorem.

But the effects of ranking first instead of second remain present in elections where the third candidate does *not* qualify, showing that strategic coordination cannot explain it all. In this case, party-level agreements lead the second candidate to drop out in one-fifth of the races when she has the same orientation as the first, a result driven mainly by left-wing parties and candidates opting to go with voters' preferences in the first round. In addition, voters rallying behind the first increase her likelihood of winning by 4.9 to 5.9 percentage points on average, conditional on staying in the second round. This effect is most likely driven by a behavioral motive: the desire to vote for the winner.

This last result is perhaps more unsettling. Mainstream political economy models predict that election outcomes and policies implemented by elected leaders correspond to voter preferences. In citizen-candidate models, the candidate proposing the platform preferred by the largest group of voters gets elected (Osborne and Slivinski 1996; Besley and Coate 1997); in the median voter theorem, competing parties align their platforms with the policy preference of the voter most representative of the electorate by virtue of being located at the median (Downs 1957). By contrast, we find that many elections are swayed by a relatively small fraction of voters following their preference to be on the winning side rather than by substantive differences between candidates.

This result also has implications for the choice of an optimal voting rule. A large literature compares voter incentives to misrepresent their true preferences and strate-gically adjust their choices to the expected behavior of others under different voting rules (e.g., Laslier 2009; Balinski and Laraki 2011; Dasgupta and Maskin 2019). Our findings indicate that voters' actual preferences may themselves depend on others' behavior. This phenomenon affects the outcome of many races and adds a new layer of complexity to the problem of preference aggregation. It should be taken into account when debating voting rules and regulating the provision of electoral information.

## REFERENCES

- ACE Electoral Knowledge Network. 2018. "Comparative Data." Electoral Knowledge Network. https://aceproject.org/epic-en/ (accessed June 19, 2018).
- **Agranov, Marina, Jacob K. Goeree, Julian Romero, and Leeat Yariv.** 2018. "What Makes Voters Turn Out: The Effects of Polls and Beliefs." *Journal of the European Economic Association* 16 (3): 825–56.
- Alvarez, R. Michael, and Jonathan Nagler. 2000. "A New Approach for Modeling Strategic Voting in Multiparty Elections." *British Journal of Political Science* 30 (1): 57–75.
- Anagol, Santosh, and Thomas Fujiwara. 2016. "The Runner-up Effect." *Journal of Political Economy* 124 (4): 927–91.
- **Ansolabehere, Stephen, James M. Snyder, and Charles Stewart.** 2000. "Old Voters, New Voters, and the Personal Vote: Using Redistricting to Measure the Incumbency Advantage." *American Journal of Political Science* 44 (1): 17–34.
- Arrow, Kenneth J. 1951. Social Choice and Individual Values. New Haven, CT: Yale University Press.
- **Atkeson, Lonna Rae.** 1999. "Sure, I Voted for the Winner!' Overreport of the Primary Vote for the Party Nominee in the National Election Studies." *Political Behavior* 21 (3): 197–215.
- Balinski, Michel, and Rida Laraki. 2011. *Majority Judgment: Measuring, Ranking, and Electing*. Cambridge, MA: MIT Press.
- Banerjee, Abhijit V. 1992. "A Simple Model of Herd Behavior." *Quarterly Journal of Economics* 107 (3): 797–817.
- Barankay, Iwan. 2018. "Rank Incentives: Evidence from a Randomized Workplace Experiment." Unpublished.
- Bartels, Larry M. 1985. "Expectations and Preferences in Presidential Nominating Campaigns." American Political Science Review 79 (3): 804–15.
- **Bartels, Larry M.** 1988. *Presidential Primaries and the Dynamics of Public Choice*. Princeton, NJ: Princeton University Press.
- Bekkouche, Yasmine, Julia Cage, and Edgard Dewitte. 2022. "The Heterogeneous Price of a Vote: Evidence from Multiparty Systems, 1993–2017." *Journal of Public Economics* 206: 104559.
- Besley, Timothy, and Stephen Coate. 1997. "An Economic Model of Representative Democracy." *Quarterly Journal of Economics* 112 (1): 85–114.
- Blais, André, and Indridi H. Indridason. 2007. "Making Candidates Count: The Logic of Electoral Alliances in Two-Round Legislative Elections." *Journal of Politics* 69 (1): 193–205.
- Blais, André, and Peter John Loewen. 2009. "The French Electoral System and its Effect." West European Politics 32 (2): 345–59.
- Bordignon, Massimo, Tommaso Nannicini, and Guido Tabellini. 2016. "Moderating Political Extremism: Single Round versus Runoff Elections under Plurality Rule." *American Economic Review* 106 (8): 2349–70.
- Bormann, Nils Christian, and Matt Golder. 2013. "Democratic Electoral Systems around the World, 1946–2011." *Electoral Studies* 32 (2): 360–69.
- Bouton, Laurent. 2013. "A Theory of Strategic Voting in Runoff Elections." American Economic Review 103 (4): 1248–88.
- Bouton, Laurent, Micael Castanheira, and Aniol Llorente-Saguer. 2016. "Divided Majority and Information Aggregation: Theory and Experiment." *Journal of Public Economics* 134: 114–28.

- Bouton, Laurent, Jorge Gallego, Aniol Llorente-Saguer, and Rebecca Morton. 2019. "Runoff Elections in the Laboratory." Economic Journal 132 (641): 106-46.
- Browne, Eric C., and Mark N. Franklin. 1973. "Aspects of Coalition Payoffs in European Parliamentary Democracies." American Political Science Review 67 (2): 453-69.
- Callander, Steven. 2007. "Bandwagons and Momentum in Sequential Voting." Review of Economic Studies 74 (3): 653–84.
- Callander, Steven. 2008. "Majority Rule When Voters Like to Win." Games and Economic Behavior 64 (2): 393-420.
- Calonico, Sebastian, Matias D. Cattaneo, Max H. Farrell, and Rocio Titiunik. 2019. "Regression Discontinuity Designs Using Covariates." Review of Economics and Statistics 101 (3): 442-51.
- Calonico, Sebastian, Matias D. Cattaneo, and Rocio Titiunik. 2014. "Robust Nonparametric Confidence Intervals for Regression-Discontinuity Designs." Econometrica 82 (6): 2295–326.
- Carr, Adam. 1999–2022. "Adam Carr's Election Archive." http://psephos.adam-carr.net/ (accessed June 19, 2018).
- Cipullo, Davide, 2021. "Voting Systems and Fiscal Policy: Evidence from Runoff and Plurality Elections." National Tax Journal 74 (2): 347-76.
- Cirone, Alexandra, Gary W. Cox, and Jon H. Fiva. 2020. "Seniority-Based Nominations and Political Careers." American Political Science Review 115 (1): 234–51.
- CNCCFP. 1992–2017. "Élections." Commission Nationale des Comptes de Campagne et des Financements Politiques, Élections. http://www.cnccfp.fr/index.php?art=584[http://www.cnccfp.fr/index. php?art=584 (accessed May 11, 2016).
- Cox, Gary W. 1997. Making Votes Count: Strategic Coordination in the World's Electoral Systems. Cambridge, UK: Cambridge University Press.
- Cox, Gary W., and Jonathan N. Katz. 1996. "Why Did the Incumbency Advantage in U.S. House Elections Grow?" American Journal of Political Science 40 (2): 478-97.
- Dal Bo, Ernesto, and Frederico Finan. 2018. "Progress and Perspectives in the Study of Political Selection." Annual Review of Economics 10: 541-75.
- Dasgupta, Partha, and Eric Maskin. 2019. "Elections and Strategic Voting: Condorcet and Borda." Unpublished.
- Da Silveira, Bernardo S., and João M. P. de Mello. 2011. "Campaign Advertising and Election Outcomes: Quasi-Natural Experiment Evidence from Gubernatorial Elections in Brazil." Review of Economic Studies 78 (2): 590-612.
- De la Cuesta, Brandon, and Kosuke Imai. 2016. "Misunderstandings about the Regression Discontinuity Design in the Study of Close Elections." Annual Review of Political Science 19:375-96.
- Deltas, George, Helios Herrera, and Mattias K. Polborn. 2016. "Learning and Coordination in the Presidential Primary System." Review of Economic Studies 83 (4): 1544-78.
- Denter, Philipp, and Dana Sisak. 2015. "Do Polls Create Momentum in Political Competition?" Journal of Public Economics 130: 1–14.
- Dow Jones & Company. 1997-2017. "Factiva." Dow Jones Factiva. https://global.factiva.com (accessed May 24, 2018).
- Downs, Anthony. 1957. "An Economic Theory of Political Action in a Democracy." Journal of Political Economy 65 (2): 135–50.
- Dulay, Dean, and Laurence Go. 2021. "First among Equals: The First Place Effect and Political Promotion in Multi-Member Plurality Elections." Journal of Public Economics 200: 104455.
- Duverger, Maurice. 1954. Political Parties: Their Organization and Activity in the Modern State. London: Wiley.
- Eggers, Andrew C. 2015. "Proportionality and Turnout: Evidence from French Municipalities." Comparative Political Studies 48 (2): 135-67.
- Eggers, Andrew C., Anthony Fowler, Jens Hainmueller, Andrew B. Hall, and James M. Snyder. 2015. "On the Validity of the Regression Discontinuity Design for Estimating Electoral Effects: New Evidence from Over 40,000 Close Races." American Journal of Political Science 59 (1): 259-74.
- Eggers, Andrew C., and Nick Vivyan. 2020. "Who Votes More Strategically?" American Political Science Review 114 (2): 470–85.
- Erikson, Robert S. 1971. "The Advantage of Incumbency in Congressional Elections." Polity 3 (3): 395-405.
- Erikson, Robert S., and Rocío Titiunik. 2015. "Using Regression Discontinuity to Uncover the Personal Incumbency Advantage." *Quarterly Journal of Political Science* 10 (1): 101–19.
- Farrell, David. 2011. Electoral Systems: A Comparative Introduction. London: Red Globe Press.

- **Fauvelle-Aymar, Christine, and Abel François.** 2005. "Campaigns, Political Preferences and Turnout: An Empirical Study of the 1997 French Legislative Elections." *French Politics* 3 (1): 49–72.
- Feddersen, Timothy, and Wolfgang Pesendorfer. 1997. "Voting Behavior and Information Aggregation in Elections with Private Information." *Econometrica* 65 (5): 1029–58.
- Ferreira, Fernando, and Joseph Gyourko. 2009. "Do Political Parties Matter? Evidence from U.S. Cities." *Quarterly Journal of Economics* 124 (1): 399–422.
- Fey, Mark. 1997. "Stability and Coordination in Duverger's Law: A Formal Model of Preelection Polls and Strategic Voting." American Political Science Review 91 (1): 135–47.
- Fiva, Jon H., and Daniel M. Smith. 2018. "Political Dynasties and the Incumbency Advantage in Party-Centered Environments." *American Political Science Review* 112 (3): 706–12.
- Fleitas, Daniel W. 1971. "Bandwagon and Underdog Effects in Minimal-Information Elections." American Political Science Review 65 (2): 434–38.
- Folke, Olle, Torsten Persson, and Johanna Rickne. 2016. "The Primary Effect: Preference Votes and Political Promotions." *American Political Science Review* 110 (3): 559–78.
- Forsythe, Robert, Roger B. Myerson, Thomas A. Rietz, and Robert J. Weber. 1993. "An Experiment on Coordination in Multi-candidate Elections: The Importance of Polls and Election Histories." *Social Choice and Welfare* 10 (3): 223–47.
- Foucault, Martial, and Abel François. 2005. "Le Rendement des Dépenses Électorales en France." *Revue Economique* 56 (5): 1125–43.
- Fujiwara, Thomas. 2011. "A Regression Discontinuity Test of Strategic Voting and Duverger's Law." Quarterly Journal of Political Science 6: 197–233.
- Fujiwara, Thomas, and Carlos Sanz. 2020. "Rank Effects in Bargaining: Evidence from Government Formation." *Review of Economic Studies* 87 (3): 1261–95.
- Gamson, William A. 1961. "A Theory of Coalition Formation." *American Sociological Review* 26 (3): 373–82.
- Gelman, Andrew, and Gary King. 1990. "Estimating Incumbency Advantage without Bias." *American Journal of Political Science* 34 (4): 1142–64.
- Gelman, Andrew, Sharad Goel, Douglas Rivers, and David Rothschild. 2016. "The Mythical Swing Voter." *Quarterly Journal of Political Science* 11 (1): 103–30.
- Golder, Sona N. 2005. "Pre-electoral Coalitions in Comparative Perspective: A Test of Existing Hypotheses." *Electoral Studies* 24 (4): 643–63.
- Golder, Sona N. 2006. "Pre-electoral Coalition Formation in Parliamentary Democracies." British Journal of Political Science 36 (2): 193–212.
- **Granzier, Riako, Vincent Pons, and Clemence Tricaud.** 2023. "Replication Data for: Coordination and Bandwagon Effects: How Past Rankings Shape the Behavior of Voters and Candidates." American Economic Association [publisher], Inter-university Consortium for Political and Social Research [distributor]. https://doi.org/10.3886/E172161V1.
- Hall, Andrew B., and James M. Snyder. 2015. "Information and Wasted Votes: A Study of U.S. Primary Elections." *Quarterly Journal of Political Science* 10 (4): 433–59.
- Hartzmark, Samuel M. 2015. "The Worst, the Best, Ignoring All the Rest: The Rank Effect and Trading Behavior." *Review of Financial Studies* 28 (4): 1024–59.
- Hinich, Melvin J. 1981. "Voting as an Act of Contribution." Public Choice 36 (1): 135–40.
- Hung, Angela A., and Charles R. Plott. 2001. "Information Cascades: Replication and an Extension to Majority Rule and Conformity-Rewarding Institutions." *American Economic Review* 91 (5): 1508–20.
- Hyde, Susan D., and Nikolay Marinov. 2012. "Which Elections Can Be Lost?" *Political Analysis* 20 (2): 191–201.
- Imbens, Guido, and Karthik Kalyanaraman. 2012. "Optimal Bandwidth Choice for the Regression Discontinuity Estimator." *Review of Economic Studies* 79 (3): 933–59.
- Imbens, Guido, and Thomas Lemieux. 2008. "Regression Discontinuity Designs: A Guide to Practice." Journal of Econometrics 142 (2): 615–35.
- Indridason, Indridi H. 2008. "When to Run and When to Hide: Electoral Coordination and Exit." *Economics and Politics* 20 (1): 80–105.
- Kahneman, Daniel. 2003. "Maps of Bounded Rationality: Psychology for Behavioral Economics." American Economic Review 93 (5): 1449–75.
- Kawai, Kei, and Yasutora Watanabe. 2013. "Inferring Strategic Voting." American Economic Review 103 (2): 624–62.
- Kiss, Áron, and Gábor Simonovits. 2014. "Identifying the Bandwagon Effect in Two-Round Elections." *Public Choice* 160 (3–4): 327–44.

- Knight, Brian, and Nathan Schiff. 2010. "Momentum and Social Learning in Presidential Primaries." Journal of Political Economy 118 (6): 1110–50.
- Kollman, Ken, Allen Hicken, Daniele Caramani, David Backer, and David Lubin. 2018. "Data File and Codebook" Constituency-Level Elections Archive. https://electiondataarchive.org/data-anddocumentation/clea-lower-chamber-elections-archive/ (accessed June 19, 2018).
- Laslier, Jean-François. 2009. "The Leader Rule: A Model of Strategic Approval Voting in a Large Electorate." *Journal of Theoretical Politics* 21 (1): 113–36.
- Lee, David S. 2008. "Randomized Experiments from Non-random Selection in US House Elections." Journal of Econometrics 142 (2): 675–97.
- Lee, David S. 2009. "Training, Wages, and Sample Selection: Estimating Sharp Bounds on Treatment Effects." *Review of Economic Studies* 76 (3): 1071–102.
- Le Pennec, Caroline, and Vincent Pons. 2020. "How Do Campaigns Shape Vote Choice? Multi-country Evidence from 62 Elections and 56 TV Debates." NBER Working Paper 26572.
- Lublin, David. 2015–2016. "Election Passport." http://www.electionpassport.com/ (accessed June 19, 2018).
- McAllister, Ian, and Donley T. Studlar. 1991. "Bandwagon, Underdog, or Projection? Opinion Polls and Electoral Choice in Britain, 1979–1987." *Journal of Politics* 53 (3): 720–41.
- McCrary, Justin. 2008. "Manipulation of the Running Variable in the Regression Discontinuity Design: A Density Test." *Journal of Econometrics* 142 (2): 698–714.
- Meriläinen, Jaakko, and Janne Tukiainen. 2016. "Primary Effect in Open-List Elections." Unpublished.
- Ministère de l'Intérieur Français. 1992–2017. "Les Données Relatives aux Élections et Aux Référendums." https://www.data.gouv.fr/fr/pages/donnees-des-elections/ (accessed September 21, 2016).
- Morton, Rebecca B., and Kai Ou. 2015. "What Motivates Bandwagon Voting Behavior: Altruism or a Desire to Win?" *European Journal of Political Economy* 40: 224–41.
- Morton, Rebecca B., and Kenneth C. Williams. 1999. "Information Asymmetries and Simultaneous versus Sequential Voting." *American Political Science Review* 93 (1): 51–67.
- Morton, Rebecca B., Daniel Muller, Lionel Page, and Benno Torgler. 2015. "Exit Polls, Turnout, and Bandwagon Voting: Evidence from a Natural Experiment." *European Economic Review* 77: 65–81.
- Murphy, Richard, and Felix Weinhardt. 2020. "Top of the Class: The Importance of Ordinal Rank." *Review of Economic Studies* 87 (6): 2777–826.
- Myatt, David P. 2007. "On the Theory of Strategic Voting." Review of Economic Studies 74 (1): 255-81.
- Myerson, Roger B., and Robert J. Weber. 1993. "A Theory of Voting Equilibria." American Political Science Review 87 (1): 102–14.
- **Osborne, Martin, and Al Slivinski.** 1996. "A Model of Political Competition with Citizen-Candidates." *Quarterly Journal of Economics* 111 (1): 65–96.
- Palfrey, Thomas R. 1989. "A Mathematical Proof of Duverger's Law." In *Models of Strategic Choice in Politics*, edited by Peter C. Ordeshook, 69–92. Ann Arbor, MI: University of Michigan Press.
- Piketty, Thomas. 2000. "Voting as Communicating." Review of Economic Studies 67 (1): 169-91.
- **Pons, Vincent, and Clémence Tricaud.** 2018. "Expressive Voting and Its Cost: Evidence from Runoffs with Two or Three Candidates." *Econometrica* 86 (5): 1621–49.
- Pope, Devin G. 2009. "Reacting to Rankings: Evidence from "America's Best Hospitals" Journal of Health Economics 28 (6): 1154–65.
- Simon, Herbert A. 1954. "Bandwagon and Underdog Effects and the Possibility of Election Predictions." Public Opinion Quarterly 18 (3): 245–53.
- Solow, Benjamin. 2016. "Aggregate Uncertainty in Runoff Elections." Unpublished.
- Spenkuch, Jörg L. 2015. "Please Don't Vote for Me: Voting in a Natural Experiment with Perverse Incentives." *Economic Journal* 125 (585): 1025–52.
- Spenkuch, Jörg L. 2018. "Expressive vs. Strategic Voters: An Empirical Assessment." Journal of Public Economics 165: 73–81.
- Spenkuch, Jörg L., and David Toniatti. 2018. "Political Advertising and Election Results." *Quarterly Journal of Economics* 133 (4): 1981–2036.
- Tversky, Amos, and Daniel Kahneman. 1981. "The Framing of Decisions and the Psychology of Choice." *Science* 211 (4481): 453–58.
- Warwick, Paul V., and James N. Druckman. 2006. "The Portfolio Allocation Paradox: An Investigation into the Nature of a Very Strong but Puzzling Relationship." *European Journal of Political Research* 45 (4): 635–65.
- Wright, Gerald C. 1993. "Errors in Measuring Vote Choice in the National Election Studies, 1952–88." American Journal of Political Science 37 (1): 291–316.