Hurricane Michael and Floridian Turnout*

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4 Abstract

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The United States is facing unprecedented challenges to election administration from the novel coronavirus. In response, many election administrators and advocates are calling for expanded vote-by-mail options to reduce in-person voting. To test the efficacy of loosened vote-by-mail rules we look to the experience of Florida in 2018, when Hurricane Michael devastated parts of the panhandle. By leveraging cross-jurisdiction variation in loosened restrictions in a double-matched triple-differences model, we show that loosened restrictions on vote-by-mail alone were not successful at eliminating administrative costs to voting. As administrators around the country loosen mail-voting restrictions in advance of this fall, they must couple these eased restrictions with strong public education campaigns about how voters can take advantange of them.

^{*}The authors thanks Many People for their comments on this project. All errors are our responsibility.

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15 Introduction

The hurricane likely directly reduced individual voters' propensity to vote. We know that Hurricane Michael caused substantial destruction; as discussed in the introduction to this paper, residents lost their lives, flooding was widespread, and the hurricane caused billions of dollars of property damage. Would-be voters were now faced with myriad disruptions to their daily lives; it is likely that the direct effects of the weather, therefore, reduced turnout substantially. As professor emeritus Robert Montjoy told NPR in the aftermath of the storm, "Whether casting a ballot becomes a higher priority than cleaning out the basement, visiting someone in the hospital, or all the other demands... You certainly expect a lower turnout for those reasons" (Parks 2018). The hurricane also caused problems for county election administrators, as the reporting around the Governor's executive order makes clear. Some mail voters were residing in locations other than their registered addresses; would-be poll workers were unavailable; and the eight counties covered by the executive order collectively saw just 62 of the anticipated 127 polling places opened. Absent mitigation, the administrative effects of Hurricane Michael likely would have decreased turnout above-and-beyond the individual effects of the storm. Executive Order 18-283 sought to offset the administrative barriers to voting by allowing county election administrators to flexibly respond to the damage wrought by the storm. Specifically, Executive Order 18-283 allowed administrators to add early voting locations; begin early voting 15 days before the general election, and continue until the day of the election; to accept vote-by-mail requests to addresses other than a voter's registered address; to send vote-by-mail ballots by forwardable mail; to deliver vote-by-mail ballots to electors or electors' immediate family members on election day without an affidavit; to relocate or 37 consolidate polling places; and required poll watchers to be registered by the second Friday before the general election.

¹See https://www.flgov.com/wp-content/uploads/2018/10/SLT-BIZHUB18101809500.pdf.

²We use the terms mail and absentee voting interchangeably throughout this paper.

- This paper sets out to answer a number of questions: what was the total depressive effect of
- the hurricane? Did Executive Order 18-283 effectively offset the depressive administrative
- effects? More specifically, did easing mail-balloting rules reduce the impact of closed polling
- 43 places?

44 Literature Review

- 45 This study lies at the intersection of three components of the broader turnout literature:
- the effects of inclement and severe weather, the capacity for convenience voting reforms to
- 47 increase participation in elections, and the ability of local election officials to increase turnout
- by placing polls where voters are able to access them. Our general observation is that while
- the effects of weather are often negative with regard to participation in elections, the leverage
- 50 for voting reforms and local officials to counterbalance those depressive effects are limited.

51 Weather Effects

- Variations in weather on election day are generally thought be exogenous to elections (Hans-
- ford and Gomez 2010, 269), but also have a clear effect on turnout. (???) observes "[v]ariable
- weather patterns are also likely to affect turnout since these too would be regarded as a vari-
- able cost in the act of voting" (78). This question has been frequently examined in the
- 56 United States.
- 57 While the studies produce divergent point estimates, the consensus is that turnout is lower
- 58 in the presence of rain on election day (???; Fujiwara, Meng, and Vogl 2016; Hansford
- 59 and Gomez 2010; Fraga and Hersh 2010; Gomez, Hansford, and Krause 2007; Shachar and
- Nalebuff 1999; Knack 1994; Merrifield 1993). The effect of rain on turnout, however, is
- 61 strongest among voters with less of a sense that voting is a civic duty and altogether absent
- among voters with a strong sense of civic duty (Knack 1994). Fraga and Hersh (2010) find the

decrease in turnout is only found in uncompetitive counties; a competitive race is sufficient to induce voters to cast a ballot in the rain. (???) find the effect of rain is most pronounced in general elections (where more peripheral voters are brought into the electorate) than primary elections (where the electorate tends to be more partisan). In a comparative context, a study in Sweden (Persson, Sundell, and Öhrvall 2014) found no significant turnout effects of rain on election day, in part due to Sweden's permissive early voting regime. Cite Dynamic

⁶⁹ Voting study of Japanese voting in the 2017 election here

Rain on election day may not be relevant to the considerably more severe damage that follows after a hurricane. Previous natural disasters, such as Hurricane Sandy (2012) in Connecticut, New Jersey and New York and Hurricane Katrina (2005) in New Orleans, may give a better set of boundary conditions on our expectations of how severe, as opposed to inclement, weather may alter electoral behavior. Studies of these events found lower turnout within effected geographic areas (Lasala-Blanco, Shapiro, and Rivera-Burgos 2017; Stein 2015; Debbage et al. 2014; Sinclair, Hall, and Alvarez 2011). Stein (2015) observes, however, that the interactive effect of residing in a county covered by the disaster and the provision of early in-person voting increased turnout. Sinclair, Hall, and Alvarez (2011) also find non-linear effects, where people who experienced considerable flooding were more likely to vote in the subsequent election.

81 Early voting and turnout

Florida, like Sweden, has a permissive convenience voting regime. Registered voters can present themselves at an early in-person polling place to cast a ballot in advance of election day. Registered voters can also request a mail ballot on an unrestricted basis and return that ballot as early as 15 days before the election. Can these reforms increase turnout? This question is not yet resolved in the literature; we are left unsatisfyingly answering the question about turnout effects of convenience voting reforms with both "'no' and 'yes'" (???).

There is evidence for a variety of effects when looking at turnout effects of convenience voting reforms. Early in-person voting increased turnout in the 1994 elections among Tennessee counties (???). Vote compers also increased turnout in Larimer County, Colorado (Stein and Vonnahme 2008). That being said early voting as a broad reform (i.e. combining mail 91 voting) decreased turnout in the 2004 and 2008 elections (Burden et al. 2014). The literature 92 on turnout effects of elections conducted entirely via the mail, however, is similarly mixed. 93 Studies of presidential elections find absentee voting increases turnout (Leighley and Nagler 2014), though that effect is not found in studies that include midterm elections (Fitzgerald 2005). The picture is no clearer when we look at elections conducted entirely by mail. That reform increases turnout in Washington (???; ???), decreases turnout in California (???; ???; Kousser and Mullin 2007), and has no significant effect in Oregon (???). A recent, national study finds a small boost to turnout following from the adoption of Oregon-style voting by mail (???). 100

o Polling Place Consolidation

One element of election administration that local authorities can control is the location of 102 polling places. The executive order issued after Hurricane Michael empowered local election 103 officials in the eight affected counties to move or consolidate polling places at will. Relocating 104 or reducing the number of polling places in turn reduces turnout by imposing new search and 105 transportation costs on voters (Brady and McNulty 2011). A moved polling place reduces 106 turnout in a variety of electoral contexts (Cantoni 2020), including local elections (McNulty, 107 Dowling, and Ariotti 2009; Haspel and Knotts 2005) as well as national contests (???). 108 Absentee voting is more likely as the distance to the polls increases, but this effect is not 109 large enough to offset the decrease from consolidation itself (Brady and McNulty 2011; Dyck 110 and Gimpel 2005). 111

The effect of distance to the polling place on voting is nonlinear (Dyck and Gimpel 2005,

541–42; Gimpel and Schuknecht 2003, 481–84). A study of three counties in Maryland in the 2000 election finds moving 1 mile *closer* to the polls makes voting *more* likely by 0.45 points, while observing generally "[t]urnout is highest when distances to the polling place are very short, and when they are excessively long, but lower in the middling ranges of distance" (Gimpel and Schuknecht 2003, 481).

Grounding our analyses of the effects of Hurricane Michael gives us some expectations as to

how the hurricane will alter voting behavior. We expect the direct, weather-related effects of 119 the hurricane to reduce turnout. Perhaps as a countervailing force, the loosened restrictions 120 on mail voting and relieve valve offered by early voting will recover some but not all of these 121 displaced voters. The necessary rearrangement of polling places after some planned sites 122 were destroyed will, we expect, similarly reduce turnout by introducing new costs to the act 123 of voting. This is, of course, not to claim that the local officials in the path of the hurricane 124 sought to reduce turnout. Rather, the work of administering an election — even under the best of circumstances — is difficult. The extraordinary impact of a Category 5 hurricane 126 is perhaps simply too much for election administrators to incorporate into their efforts to conduct a secure and inclusive election.

129 Research Design and Expectations

We expect that Hurricane Michael depressed turnout in the 2018 midterm election via two causal mechanisms: individual-level effects, and administrative effects.

Estimating the Net Effects of the Hurricane

133 We begin by testing the net effect of each of these treatments on individual-level turnout.

Our central identification strategy involves the use of difference-in-differences models. We

use voter-file data from L2 Political to estimate individual-level turnout and to control for

individual-level characteristics. L2 uses models to predict individual race / ethnicity and voters' sex but these characteristics are available in self-reported form in the raw voter-file available from the state; as such, we pull sex and race / ethnicity from the publicly available voter file. The L2 data is based on the February 8, 2019, version of the raw voter file, the same file from which we pull race / ethnicity and sex.

By comparing historical and 2018 turnout for voters in the counties hit by the storm to 141 historical and 2018 turnout of voters elsewhere in the state, we can estimate the effect 142 of the storm on turnout. To ensure a high-quality difference-in-differences specification, 143 we do not include all untreated voters in our control group; rather, we genetically match 144 (Sekhon 2011) each treated voter with five untreated voters along a battery of individual-145 and neighborhood-level characteristics. Untreated voters who do not serve as matches are 146 excluded from our models. Although it may seem counterintuitive to exclude data from our models, this matching procedure substantially improves the parallel trends assumptions 148 necessary for a rigorous difference-in-differences analysis. 149

This design allows us to test our first hypothesis:

Hypothesis 1: Turnout among voters in the eight treated counties was depressed in the 2018 election relative to voters in untreated counties. This represents the net effect of both the individual and administrative level treatments.

Decomposing Individual and Administrative Effects

To estimate the administrative effect on turnout, we must control for the individual-level effects of the storm. To do so, we leverage the somewhat arbitrary borders of counties in the Florida Panhandle, an approach similar to that adopted in a different context by Walker, Herron, and Smith (2019). There is no reason to believe that the effects of a hurricane would change dramatically along county borders. We assume, therefore, that voters who lived nearby one another, but on either side of a county border, faced the same weather issues

during the 2018 election. Within a narrow buffer around the county border, we can conceive of a voter's county as effectively randomly assigned. Any observed turnout differential, therefore, is attributable to the county in which they happen to live. Our treated voters lived in counties where polling places could be closed or moved shortly before the election, and also where some restrictions were eased, which could have altered turnout.

Of course, self-selection around a geographic boundary is entirely possible; as such, conceiv-166 ing of the administrative boundary as a quasi-random assignment is perhaps too strong of 167 an assumption. Treated and control voters, despite living very near to one another, might 168 differ in meaningful ways. To address this potential problem, we adopt the technique de-169 veloped by Keele, Titiunik, and Zubizarreta (2015) by also matching voters on either side 170 of the boundary. This allows us to directly ensure that the treated and control voters are 171 nearly identical in terms of observable characteristics. We further allow for the possibility 172 that treated and control voters have different baseline turnout propensities by incorporating historical turnout data.

By comparing the turnout of these treated and control voters, we can identify the administrative effect of the hurricane on turnout for the treated voters living within the buffer around
the border. By further comparing the turnout of these control voters to (matched) voters
elsewhere in the state, we can also estimate the individual effects of the storm, again just for
the voters who live near the administrative boundary. We call this a double-matched tripledifferences (or difference-in-difference-in-differences) specification. We lay out the specific
steps below.

We begin by constructing our set of treated voters. These treated voters include all registered voters who live in a treated county and within 2.5 miles of a bordering, untreated county (See Figure 1). Each treated voter is then matched to one voter who lives in an untreated county, but within 2.5 miles of a treated county. These matches are considered primary control voters.

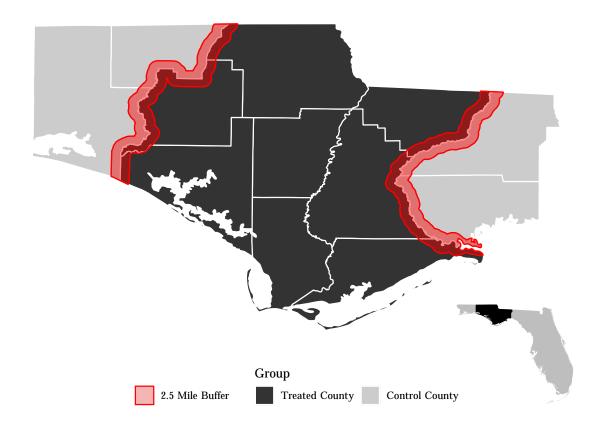


Figure 1: Treated and Control Counties with 2.5 Mile Buffer

Each treated and primary control voter is subsequently matched to five voters elsewhere in
the state — that is to say, voters who are neither in the treated counties nor in the counties
directly surrounding the treated counties. This exercise is the second match, and the matches
are our "secondary control voters." These voters were subject to neither individual-level nor
administrative-level treatments.

At this point, we have three distinct groups of voters:

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- Treated voters. These voters were subject to individual- and administrative-level effects from Hurricane Michael
- Primary control voters. These voters were subject to individual, but not administrative, effects from Hurricane Michael.

- Secondary control voters. These voters were subject to neither individual nor administrative effects.
- Having constructed our pool of voters, we run a triple-differences model. This triple-
- differences model is, in effect, two simultaneous difference-in-differences models. The model
- 201 estimates whether 2018 was associated with depressed turnout for our primary control voters
- vis-à-vis their controls. Because these primary control voters lived in counties not covered
- by the executive order, we assume that they faced no administrative effects from the storm.
- 204 Any observed difference between these groups is therefore the individual-level effect of the
- storm for primary control voters and, by extension, the treated voters.
- The model also estimates turnout differences between treated and primary control voters.
- Because we assume these closely-located voters faced identical individual-level effects, any
- 208 difference between treated and primary control voters is the administrative effect on turnout
- of living in a treated county.
- The double-matched triple-differences model allows us to test our second and third hypothe-
- 211 Ses:
- Hypothesis 2: We expect that the hurricane had negative individual-level effects for voters
- 213 who lived just outside of treated counties.
- Hypothesis 3: We expect that the administrative effects of Hurricane Michael were nega-
- tive, notwithstanding Executive Order 18-283.

Vote Mode

- 217 After estimating the double-matched triple-differences model, we turn to vote-mode within
- the treated counties. We submitted public records requests to each of the eight counties
- covered by the executive order requesting the planned and actual location of each polling
- place. Two counties Calhoun and Liberty were able to use all of their expected polling

places. Others were either forced to relocate or consolidate polling places. Most notably,
Bay County went from an expected 44 polling places to just six.

To estimate the efficacy of mail-voting within the treated counties, we begin by calculating
how far each voter lived from the closest planned polling place, and how far she lived from
the closest polling place that was actually open on election day. Using the registered voter
file, we can tell not only whether a voter participated, but also how they participated. Using
a multinomial logistic regression, we test whether the difference between the planned and
actual distance-to-polling-place were associated with vote-mode in 2018. This specification
allows us to test our final hypothesis:

Hypothesis 4: As the difference between the actual and planned distance to the closest polling place increased for voters, they were more likely to vote absentee and to abstain from voting, relative to past behavior, all else being held equal.

Results

Overall Turnout Effects

We begin by matching each registered voter in the eight treated counties to five untreated voters elsewhere in the state using a genetic matching algorithm (Sekhon 2011).³ The individual-level characteristics come directly from the L2 and the registered voter file. The two neighborhood-level characteristics included — median income and share of the population with some collegiate education — are estimated at the block group level, and come from the ACS 5-year estimates ending with 2018. Ties are not broken, which means that some treated voters are assigned more than five control voters; the weights used in the regressions below are adjusted accordingly.

 $^{^{3}}$ Due to computing constraints, the matching weights were constructed using a one percent random sample stratified by treatment status.

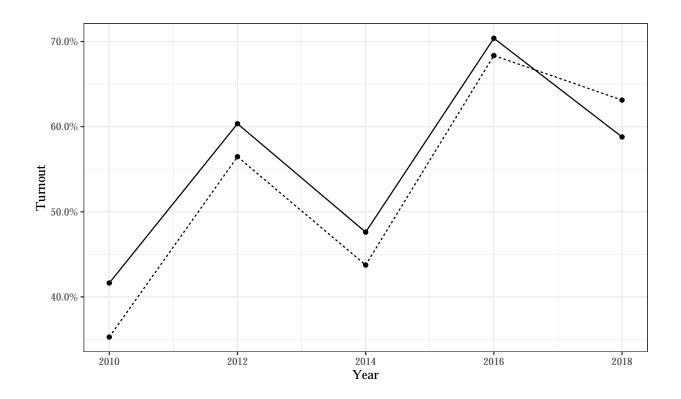
Although the treated counties were the at the center of the storm, nearby counties might
have also been negatively impacted by the storm. Therefore, voters who live in the counties
that border the treated counties are excluded as potential controls. These include Walton,
Holmes, Wakulla, and Leon Counties.

Table 1 demonstrates the results of this matching procedure. As Table 1 makes clear, voters in the affected counties were considerably more likely to be white and identify as Republicans, and live in lower-income neighborhoods, than voters in the rest of the state. The post-match control group, however, looks substantially similar to the treated voters.

Table 1: Balance Table for Statewide Matching

	Means: Unmatched Data		Means: Matched Data		Percent Improvement			
	Treated	Control	Treated	Control	Mean Diff	eQQ Med	eQQ Mean	eQQ Max
%White	76.5%	62.3%	76.5%	76.5%	100.00	100.00	100.00	100.00
% Black	17.1%	13.1%	17.1%	17.1%	100.00	100.00	100.00	100.00
% Latino	2.1%	17.4%	2.1%	2.1%	100.00	100.00	100.00	100.00
% Asian	1.0%	2.0%	1.0%	1.0%	100.00	100.00	100.00	100.00
% Female	52.5%	52.4%	52.5%	52.5%	100.00	100.00	100.00	100.00
% Male	45.8%	44.9%	45.8%	45.8%	100.00	100.00	100.00	100.00
Age	52.2	52.5	52.2	52.2	98.54	96.68	97.36	96.17
% Democrat	39.2%	37.1%	39.2%	39.2%	100.00	100.00	100.00	100.00
% Republican	43.6%	35.0%	43.6%	43.6%	100.00	100.00	100.00	100.00
% with Some College	69.0%	75.1%	69.0%	69.0%	99.77	99.00	98.05	88.66
Median Income	\$50,643	\$62,941	\$50,643	\$50,654	99.91	98.11	96.89	86.56

Figure 2 plots the turnout in the past few elections for our treated and control voters. As
Figure 2 makes clear, treated voters consistently turned out at higher rates than control
voters from 2010 – 2016. In 2018, however, this relationship was inverted as turnout among
treated voters plummeted from its 2016 level. Although turnout among all voters was higher
in 2018 than in 2014, turnout rose by substantially less for the treated voters.



Treatment Group — Treated Group — Control Group

Figure 2: General Election Turnout for Treated and Control Voters, 2010 – 2018

Table 2 formalizes Figure 2 into a differences-in-differences regression specification. We employ an ordinary least squares specification. The dependent variable takes the value 1 if a 257 voter cast a ballot in a given year, and 0 if she did not. In each model, Treated \times 2018 258 estimates the casual (net) effect of Hurricane Michael on turnout for treated voters. Model 259 2 also includes the characteristics on which the voters were matched. Model 3, finally, adds 260 a measure for congressional district competitiveness. Because this variable is "downstream" 261 of treatment — that is to say, the effect of the hurricane could have impacted the compet-262 itiveness of certain races — it is not included in the first two models. It should be noted 263 that each of the treated voters lived in uncontested congressional districts. Robust standard 264 errors are clustered at the level of the match (Abadie and Spiess 2019).

Table 2: Turnout, 2010 — 2018

		Turnout	
	(1)	(2)	(3)
Treated	0.030***	0.030***	0.030***
	(0.001)	(0.001)	(0.001)
2018	0.236***	0.236***	0.236***
	(0.0005)	(0.0005)	(0.0005)
Midterm	-0.229***	-0.229***	-0.229***
	(0.0003)	(0.0003)	(0.0003)
Treated \times Midterm	0.022***	0.022***	0.022***
	(0.001)	(0.001)	(0.001)
Treated \times 2018	-0.094***	-0.094***	-0.094***
	(0.001)	(0.001)	(0.001)
Constant	0.624***	-0.192***	-0.202***
	(0.001)	(0.004)	(0.004)
Includes Other Matched Covariates		X	X
Includes control for CD competitiveness			X
Observations	7,893,265	7,893,265	7,893,265
\mathbb{R}^2	0.044	0.191	0.191
Adjusted R ²	0.044	0.191	0.191

^{***}p < 0.01, **p < 0.05, *p < 0.1.

Robust standard errors (clustered at level of match) in parentheses.

The coefficient on $Treated \times 2018$ in Table 2 indicates that Hurricane Michael had a substantial depressive effect in 2018 among the treated voters. Each model estimates that the
overall effect — including individual and administrative effects — was -9.4 percentage points.

Multiplied across the nearly 200 thousand registered voters in the treated counties indicates
that some 19 thousand ballots went uncast due to the hurricane, a major effect in a year
when a statewide senate race was decided by 10,033 votes.

272 Identifying Administrative Effects

As discussed above, our primary strategy for isolating the administrative effects of the hurri-273 cane on turnout involves leveraging random assignment around county borders in the Florida 274 panhandle in a double-matched triple-differences specification. Each voter inside the buffer 275 in a treated county is matched with one voter in the buffer in an untreated county, once 276 again using a genetic matching algorithm (Sekhon 2011). These matches serve as our pri-277 mary control voters. Ties are not broken, which means that some treated voters are assigned 278 multiple primary control voters; the weights used in the regressions are adjusted accordingly. 279 In some cases, voters on either side of the border are in different congressional districts. 280 This would pose a problem if these races were contested thanks to the potentially mobilizing effects of house races, but the entire buffer falls in uncontested congressional districts. This means that treated and untreated voters are not facing differential mobilization from congressional races. As before, we match on individual- and neighborhood-level characteristics. 284 Importantly, we match treated and untreated voters using their latitude and longitude to 285 ensure that matches live in close proximity to one another. Table 3 presents the results of 286 this matching exercise.

Table 3: Balance Table for Border Buffer Matching

	Means: Unmatched Data		Means: Matched Data		Percent Improvement			
	Treated	Control	Treated	Control	Mean Diff	eQQ Med	eQQ Mean	eQQ Max
%White	71.2%	74.9%	71.2%	71.2%	100.00	100.00	100.00	100.00
% Black	24.8%	18.2%	24.8%	24.7%	98.65	98.66	98.66	98.66
% Latino	1.1%	2.3%	1.1%	1.1%	100.00	100.00	100.00	100.00
% Asian	0.3%	0.8%	0.3%	0.3%	100.00	100.00	100.00	100.00
% Female	53.2%	53.0%	53.2%	53.2%	100.00	100.00	100.00	100.00
% Male	45.4%	45.1%	45.4%	45.4%	100.00	100.00	100.00	100.00
Age	53.1	50.2	53.1	53.1	98.58	87.44	86.74	81.79
% Democrat	47.2%	44.5%	47.2%	47.2%	97.59	97.60	97.60	97.60
% Republican	39.1%	37.7%	39.1%	39.1%	100.00	100.00	100.00	100.00
% with Some College	62.7%	70.0%	62.7%	63.0%	95.63	63.99	62.43	59.15
Median Income	\$45,243	\$51,335	\$45,243	\$46,004	87.50	-12.08	43.03	46.56

The match procedure improves the balance between treated and primary control voters sub-

stantially for each of the characteristics listed in Table 3. Although latitudes and longitudes are not displayed in the table, the average treated voter lives 9.5 miles from her primary con-290 trol voter. Considering that Hurricane Michael was approximately 350 miles wide (Thomas 291 and Sangalang 2018) we consider this average distance sufficiently small to assume that, on 292 average, treated and control voters were faced with identical individual-level effects. 293 Once our set of treated and primary control voters⁴ has been identified, each of these voters 294 is matched with five other voters that lived in neither the treated nor the immediately 295 surrounding counties. This matching procedure follows the same steps detailed in the Overall 296 Turnout Effects section of this paper. Table 4 presents the results of the secondary match. 297

Table 4: Balance Table for Secondary Match

We improve along all characteristics.

	Means: Unmatched Data		Means: Matched Data		Percent Improvement			
	Treated	Control	Treated	Control	Mean Diff	eQQ Med	eQQ Mean	eQQ Max
%White	71.7%	62.3%	71.7%	71.7%	100.00	100.00	100.00	100.00
% Black	23.3%	13.1%	23.3%	23.3%	100.00	100.00	100.00	100.00
% Latino	1.4%	17.4%	1.4%	1.4%	100.00	100.00	100.00	100.00
% Asian	0.5%	2.0%	0.5%	0.5%	100.00	100.00	100.00	100.00
% Female	52.7%	52.4%	52.7%	52.7%	100.00	100.00	100.00	100.00
% Male	45.6%	44.9%	45.6%	45.6%	100.00	100.00	100.00	100.00
Age	52.9	52.5	52.9	52.9	98.12	82.32	87.10	87.22
% Democrat	46.4%	37.1%	46.4%	46.4%	100.00	100.00	100.00	100.00
% Republican	38.7%	35.0%	38.7%	38.7%	100.00	100.00	100.00	100.00
% with Some College	62.9%	75.1%	62.9%	62.9%	99.98	99.30	97.16	82.78
Median Income	\$45,913	\$62,941	\$45,913	\$45,928	99.91	99.03	96.22	80.63

In Figure 3 we present the plotted turnout trends from the treatment, primary control, and secondary control groups returned by the matching exercise. Figure 3 makes clear that the turnout gap in these groups was relatively constant prior to 2018 (after accounting for differences in midterm and presidential elections), but that the relative turnout of the treatment group — whose turnout in midterm elections was historically higher than the

⁴For ease of notation, the combined set of treated and primary control voters will henceforth be referred to as "Panhandle voters," while "treated" voters will distinguish Panhandle voters in treated counties from Panhandle voters in other counties. The use of "Panhandle" is a slight misnomer: it excludes Escambia, Santa Rosa, and Okaloosa Counties which are certainly part of the Florida Panhandle, as well as Jefferson County and others to its east which are sometimes considered part of the panhandle.

other groups — noticeably dipped in 2018.

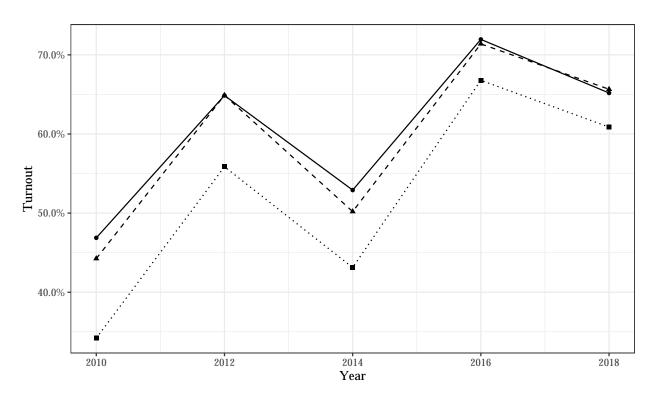


Figure 3: General Election Turnout for Treated, Primary Control, and Secondary Control Voters, 2010-2018

Disentangling the administrative and individual effects of the storm requires the estimation of the triple-differences model. This model is estimated by Equation (1).

$$\begin{split} v_{it} &= \beta_0 + \beta_1 Panhandle_i + \beta_2 2018_t + \beta_3 Panhandle_i \times 2018_t + \\ \beta_4 Treated_i + \beta_5 Treated_i \times 2018_t + \beta_6 Secondary Control Group 1_i + \\ \beta_7 Midterm_t + \beta_8 Panhandle_i \times Midterm_t + \beta_9 Treated_i \times Midterm_t + \\ \delta Z_i + \mathcal{E}_{it}. \end{split} \tag{1}$$

Individual i's turnout (v) in year t is a function of the year and their location. In the equation, $b_1 Pandhandle_i$ measures the historical difference between voters in the panhandle 308 and the rest of the state. $b_2 2018_t$ measures the statewide change in turnout in 2018 from 309 the baseline, while $b_3 Panhandle_i \times 2018_t$ tests whether turnout changed differently in 2018 310 in the panhandle than it did elsewhere. $b_3Panhandle_i \times 2018_t$, therefore, is our estimation 311 of the individual-level, or weather related, effect of the hurricane. b_4 Treated_i measures the 312 historical difference between treated and primary control voters, and $b_5 Treated_i \times 2018_t$ 313 tests whether the causal effect of the storm was different for treated voters than for their 314 primary controls. This, then, is the estimated administrative effect of living in a county 315 covered by the executive order. We also test whether the secondary control voters for the 316 treatment group had higher or lower turnout than the other set of secondary control voters 317 using $b_6 Secondary Control Group 1_i$ term. 318

Figure 3 indicates that there are different gaps between groups of voters in midterm and presidential years. These baseline differences are captured in the variables $b_7 Midterm_t$, $b_8 Panhandle_i \times Midterm_t$, and $b_9 Treated_i \times Midterm_t$. Finally, the matrix δZ_i contains the individual- and neighborhood-level characteristics on which the match was performed, included in some of the models.

Table 5 presents the results of this model, again fit using an ordinary least squares specification. Model 1 does not include δZ_i , while the matrix is included in Models 2 and 3. Model 3 also includes estimates for congressional district competitiveness in 2018. Robust standard errors are clustered at the level of the original treated voter from which the primary and secondary controls arise.

Table 5: Turnout, 2010 — 2018

		Turnout	
	(1)	(2)	(3)
Panhandle	0.081*** (0.005)	0.082*** (0.005)	0.081*** (0.005)
2018	0.222*** (0.002)	0.222*** (0.002)	0.222*** (0.002)
Panhandle \times 2018	-0.038^{***} (0.005)	-0.038^{***} (0.005)	-0.038^{***} (0.005)
Treated	0.003 (0.006)	0.003 (0.006)	0.003 (0.006)
Treated \times 2018	-0.031^{***} (0.007)	-0.031^{***} (0.007)	-0.031^{***} (0.007)
Secondary Control Group 1	0.026*** (0.002)	0.027*** (0.002)	0.026*** (0.002)
Midterm	-0.227^{***} (0.001)	-0.227^{***} (0.001)	-0.227^{***} (0.001)
Panhandle \times Midterm	0.018*** (0.004)	0.018*** (0.004)	0.018*** (0.004)
${\it Treated} \times {\it Midterm}$	0.024*** (0.005)	0.024*** (0.005)	0.024*** (0.005)
Constant	0.600*** (0.003)	-0.303^{***} (0.016)	-0.307^{***} (0.017)
Includes Other Matched Covariates Includes control for CD competitiveness		X	X X
Observations R^2 Adjusted R^2	600,955 0.048 0.048	600,955 0.178 0.178	600,955 0.178 0.178

 $^{^{***}}p<0.01,\,^{**}p<0.05,\,^*p<0.1.$ Robust standard errors (clustered at level of treated voter) in parentheses.

The coefficients on Panhandle \times 2018 and Treated \times 2018 are of most substantive interest here. The coefficient on Panhandle \times 2018 indicates that turnout for the primary control 330 voters in 2018 was -3.8 percentage points below that of the secondary controls. Put differ-331 ently, the individual-level effect of the storm for voters in the buffer zone was -3.8 points. 332 Treated \times 2018 indicates that, for voters just inside the treated counties, turnout was de-333 pressed by an additional 3.1 percentage points. This 3.1 percentage point decrease in turnout 334 for voters inside the treated counties is the administrative effect on turnout. Taken as a 335 whole, the net effect of the hurricane on voters just inside the treatment counties was there-336 fore -6.9 percentage points. Importantly, the decomposed administrative- and individual- effects estimated in Table 5 338 are the average treatment effect on the treated voters (ATT). These models include only 339 treated voters at the very edges of the hardest-hit counties. It is therefore unsurprising 340 that the net effect estimated by the triple-differences models are smaller than the net effects 341 estimated in Table 2, where all voters in the 8 treated counties are included. Nevertheless, 342 the administrative effect of -3.1 percentage points is substantively quite large. Despite the 343 efforts of Executive Order 18-283, the administrative costs imposed by Hurricane Michael 344 meaningfully depressed turnout.

Where Did the Ballots Go?

Having established that turnout was substantially depressed in the treated counties and that a non-trivial amount of the depression arose from administrative costs, we turn to a new question: where did these ballots go? We know that Executive Order 18-283 loosened restrictions on early and mail balloting; we therefore expect that, relative to the rest of the state, a higher share of ballots in the treated counties cast their ballots in one of these ways. We return to the matches produced earlier in this paper, where every voter in the treated counties was matched with five voters elsewhere in the state. Figure 4 demonstrates the
share of registered voters that cast a ballot either at the polling place, early in person, or
absentee in each general election from the past decade. In each case, the denominator is the
number of registered voters in 2018.

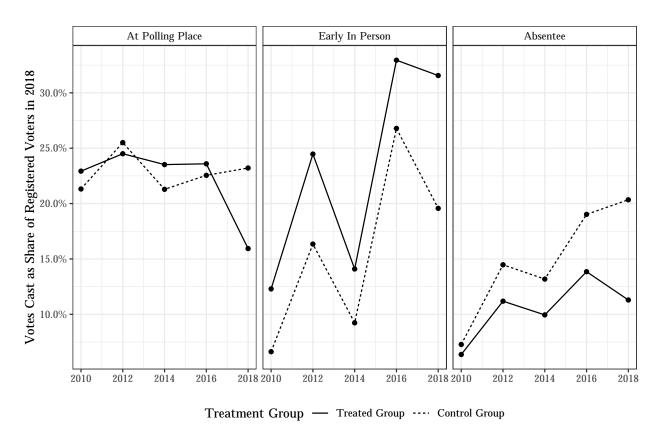


Figure 4: Marginal Effect of Relocated Polling Place on Vote Mode

Figure 4 makes clear that the decline in turnout was a product of lower turnout on election
day, and perhaps via absentee voting. It seems possible, however, that early voting was
actually higher in the treated counties due to Hurricane Michael. These plots, however, are
somewhat noisy. As such, we refrain from estimating difference-in-differences models, as the
parallel trends assumption seems to be violated by the historical data. Nevertheless, Figure
4 provides some evidence of how Hurricane Michael shifted vote methods.

To more directly estimate the effect of Hurricane Michael and the closing of polling places

on vote-mode, we measure the distance between each voter in the treated counties and the closest planned polling place, and the closest polling place actually open on election day. 365 Using a multinomial logistic regression, we test whether increasing the difference between 366 this distance is related to vote-mode or abstention in 2018. Table 6 presents the result of 367 this specification, where each option is measured relative to in-person election day voting. 368 In addition to the difference between expected and actual distance to the closest polling 369 place (Change in Distance to Polling Place (km)), we include other covariates. Distance to 370 Closest Planned Polling Place (km) measures how far a voter lived from her closest planned 371 polling place, in case voters in more remote parts of the counties generally voted differently 372 in 2018 than other voters. We include other covariates for individual characteristics such 373 as race, age, and partisan affiliation. We also include dummies indicating how (or whether) 374 each voter participated in the 2012 – 2016 general elections. The logistic coefficients are 375 transformed into relative risk ratios (standard errors are left untransformed). 376

Table 6: Vote Mode in 2018 (Relative to In-Person on Election Day)

	Abstain	Early	Absentee
	(1)	(2)	(3)
Change in Distance to Polling Place (km)	1.047*** (0.002)	1.038*** (0.002)	1.038*** (0.002)
Distance to Closest Planned Polling Place (km)	0.970*** (0.003)	0.942*** (0.003)	1.000 (0.002)
White	0.951 (0.044)	1.041 (0.048)	0.958 (0.066)
Black	0.658*** (0.047)	1.007 (0.051)	0.886* (0.070)
Latino	0.950 (0.067)	0.862** (0.075)	0.833* (0.107)
Asian	1.246** (0.092)	1.167 (0.098)	1.066 (0.136)
Male	0.964** (0.015)	1.019 (0.015)	0.998 (0.022)
Democrat	0.790*** (0.024)	0.819*** (0.026)	1.155*** (0.038)
Republican	0.656*** (0.023)	1.241*** (0.025)	1.150*** (0.036)
Age	1.001** (0.0005)	1.011*** (0.001)	1.026*** (0.001)
Constant	0.442*** (0.057)	0.310*** (0.061)	0.010*** (0.088)
Includes vote-mode in 2010, 2012, 2014, and 2016 Number of Observations McFadden Pseudo R2		X 191,211 0.269	

 $^{^{***}}p < 0.01, \, ^{**}p < 0.05, \, ^*p < 0.1.$

Table 6 indicates that for each additional kilometer a voter had to travel above-and-beyond
the distance to her planned polling place, she was more likely to vote early, to vote by mail,
and to abstain altogether than vote in-person on election day. Although these are each
statistically significant at the 99 percent level, an examination of the marginal effects plots
indicates that their relative importance differed substantially. Figure 5 presents the marginal
effect of the change in distance to the nearest polling place on vote method while keeping
all other covariates in Table 6 at their means.

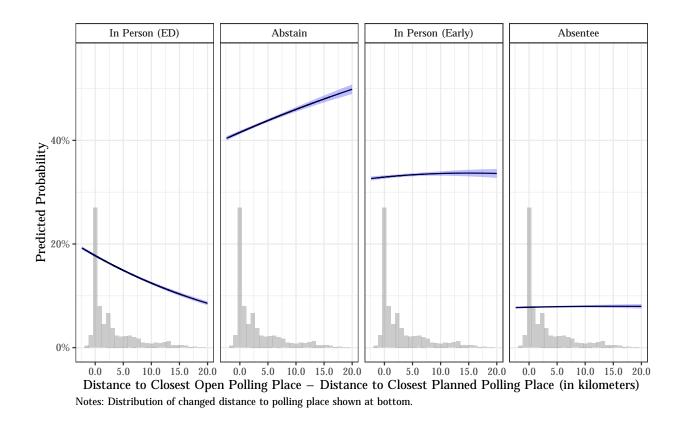


Figure 5: Marginal Effect of Changed Distance to Polling Place on 2018 Vote Mode

Figure 5 indicates that, as voters suddenly had to travel further to the nearest polling place, they were substantially less likely to vote in person on election day ("In Person (ED)"). The bulk of these voters *did not* shift to absentee voting or early in-person voting; rather, they were much more likely to abstain from casting a ballot at all. Thus, although administrators took steps to make early and mail voting easier, these efforts were not particularly effective.

Discussion and Conclusion

Election Day in the United States consistently falls near the end of hurricane season. Hurri-390 cane Michael made landfall on October 10, 2018, less than a month before the highest-turnout 391 midterm election in a century. Superstorm Sandy struck New York and New Jersey just days before the midterm elections in 2012, wreaking immense havoc. Hurricane Matthew struck the Southeastern United States weeks before the 2016 presidential election, killing dozens and causing more than \$2.5 billion in damages. Mann and Emanuel (2006) and others have linked Atlantic hurricanes to climate change, indicating that these disruptions to election 396 day activity are likely to increase in coming years. Understanding how storms of this na-397 ture impact turnout — and whether states' responses are sufficient to recoup turnout — is 398 therefore vitally important, particularly in swing states such as Florida and North Carolina. 399 The 2020 election will face a different sort of disruption: as the novel coronavirus upends 400 voting across the country, it is becoming clear that many voters will avoid physical polling 401 places, opting instead to vote by mail or to simply abstain. In response to the threat 402 posed by COVID-19 to voting, some states such as New York (Vielkind 2020) have loosened 403 restrictions on mail balloting in their primaries — just as Florida did in the parts of the 404 state hardest-hit by Hurricane Michael before the 2018 general election. Although COVID-405 19 looks much different than a hurricane, its effects on election administration promise to 406 share many similarities. We need to look no further than Milwaukee, Wisconsin's primary 407 election experience to see the similarities. Although Milwaukee generally has 182 in-person 408 voting sites, these sites were consolidated to just 5, severely depressing turnout (Morris and Miller 2020). Whether polling places are shuttered due to structural damage or a public health crisis, their closures impose costs on voters. 411

As this paper demonstrates, Florida's response to Hurricane Michael was not particularly

effective: although Governor Scott increased access to early and mail voting in eight counties,
mail balloting use in these areas actually *dropped* relative to the rest of the state (see Figure
415 4). Despite the executive order, turnout dropped substantially for voters who suddenly
416 were faced with long distances to the closest polling places. These voters did not move to
417 vote-by-mail options in appreciable numbers.

This is disheartening. Not only did the executive order fail to combat the negative individual-418 level effects of the hurricane on turnout, it was also insufficient at mitigating the negative 419 administrative effects of closed polling places. Clearly, loosening restrictions on where mail 420 ballots could be sent and how they could be returned was not enough. Without the executive 421 order, polling places would still have been moved because some had been destroyed, but the 422 loosened restrictions on other modes would not have been accesible. Thus, the executive 423 order likely reduced the administrative costs of voting. Nevertheless, these administrative 424 effects remained quite large and were responsible for nearly half the depressive effect of the storm for voters living at the outer edges of the covered counties. 426

The data at hand cannot explain why the executive order was ineffective at neutralizing the 427 administrative effects of the hurricane. The timing of the executive order, however, might 428 shed some light. Although the hurricane made landfall on October 10, the executive order was 429 not signed until more than a week later, on October 18 — fewer than three weeks before the 430 November 6 general election. This left little time for an effective public education campaign, 431 perhaps limiting the number of voters who learned and took advantage of the changed rules. 432 We found very few news articles detailing the changes and making the information easily 433 available to voters (but see WJHG - Panama City 2018; Vasquez 2018; McDonald 2018; 434 Fineout 2018), and what information did get published often listed only relocated polling 435 places with no information about loosened mail voting restrictions (see, for instance, Gadsden 436 Times 2018). It is possible, of course, that local televised news communicated the changes 437 to viewers; however, based on our search of published information, that information would have been difficult to find for voters who missed the televised news. We found no evidence that the Florida Times-Union (the largest paper in Northern Florida) or the Tampa Bay
Times (the largest paper in the state) published any articles detailing the changes brought
about by the executive order.

If election administrators do not look to past crises to understand how voters will respond,
the administrative effects of the novel coronavirus on general election turnout this fall might
be large. Future research will no doubt leverage pre-existing administrative regimes to understand the sorts of voting environments least susceptible to disruption from the coronavirus
— but such research will necessarily be backward looking. The experience of Hurricane
Michael, on the other hand, gives us important insight about how an emergency that closes
polling places will structure turnout. Our research on Executive Order 18-283 makes clear
that loosened restrictions on mail voting alone cannot combat the negative turnout effects
of shuttered polling places.

The novel coronavirus will perhaps lower turnout even if election administrators respond 452 perfectly. Voting might be low on a list of priorities for individuals who are caring for ailing 453 loved ones, grieving, or dealing with economic crises. Nevertheless, COVID-19 will also 454 pose administrative hurdles to voting: consolidated or relocated polling places, reliance on a 455 vote-by-mail system unfamiliar to many voters, or longer wait times as the number of voters 456 allowed into a polling place at once might all reduce turnout. As administrators consider 457 easing vote-by-mail restrictions, they must look to the case of Florida in 2018. More must 458 be done than simply change the rules; otherwise, the administrative effects of COVID-19 459 will magnify the individual effects of this public health crisis on voter turnout.

References

- Abadie, Alberto, and Jann Spiess. 2019. "Robust Post-Matching Inference." Working Paper.
- Brady, Henry, and John McNulty. 2011. "Turning Out to Vote: The Costs of Finding and
- Getting to the Polling Place." American Political Science Review 105 (1): 115–34.
- Burden, Barry C., David T. Canon, Kenneth R. Mayer, and Donald P. Moynihan. 2014.
- "Election Laws, Mobilization, and Turnout: The Unanticipated Consequences of Election
- Reform." American Journal of Political Science 58 (1): 95–109. https://doi.org/10.1111/
- ajps.12063.
- 469 Cantoni, Enrico. 2020. "A Precinct Too Far: Turnout and Voting Costs." American Eco-
- nomic Journal: Applied Economics 12 (1): 61–85.
- Debbage, Neil, Nick Gonsalves, J. Marshall Shepherd, and John Knox. 2014. "Superstorm
- Sandy and Voter Vulnerability in the 2012 US Presidential Election: A Case Study of
- New Jersey and Connecticut." Environmental Hazards 13: 181–99.
- 474 Dyck, Joshua, and James Gimpel. 2005. "Distance, Turnout, and the Convenience of
- Voting." Social Science Quarterly 86 (3): 531–48.
- Fineout, Gary. 2018. "Florida to Bend Voting Rules in Counties Hit by Hurricane." North-
- west Florida Daily News, October 18, 2018. https://www.nwfdailynews.com/news/
- 20181018/florida-to-bend-voting-rules-in-counties-hit-by-hurricane.
- Fitzgerald, Mary. 2005. "Greater Convenience but Not Greater Turnout: The Impact of
- Alternative Voting Methods on Electoral Participation in the United States." American
- Politics Research 33 (6): 842-67. https://doi.org/10.1177/1532673X04274066.
- Fraga, Bernard, and Eitan Hersh. 2010. "Voting Costs and Voter Turnout in Competitive
- Elections." Quarterly Journal of Political Science 5: 339–56. https://doi.org/http://dx.
- doi.org/10.1561/100.00010093 supp.

- Fujiwara, Thomas, Kyle Meng, and Tom Vogl. 2016. "Habit Formation in Voting: Evidence
- from Rainy Elections." American Economic Journal: Applied Economics 8 (4): 160–88.
- Gadsden Times. 2018. "Changes in Polling Places at Three Locations," October 30, 2018.
- https://www.gadsdentimes.com/news/20181030/changes-in-polling-places-at-three-
- locations.
- Gimpel, James, and Jason Schuknecht. 2003. "Political Participation and the Accessibility of the Ballot Box." *Political Geography* 22: 471–88.
- Gomez, Brad, Thomas Hansford, and George Krause. 2007. "The Republicans Should Pray
- for Rain: Weather, Turnout, and Voting in U.S. Presidential Elections." Journal of
- 494 Politics 69: 649–63.
- Hansford, Thomas, and Brad Gomez. 2010. "Estimating the Electoral Effects of Voter
- Turnout." American Political Science Review 104: 268–88.
- Haspel, Moshe, and H. Gibbs Knotts. 2005. "Location, Location, Location: Precinct Place-
- ment and the Costs of Voting." Journal of Politics 67 (2): 560–73.
- Keele, Luke, Rocío Titiunik, and José R. Zubizarreta. 2015. "Enhancing a Geographic
- Regression Discontinuity Design Through Matching to Estimate the Effect of Ballot
- Initiatives on Voter Turnout." Journal of the Royal Statistical Society: Series A (Statistics
- in Society) 178 (1): 223–39. https://doi.org/10.1111/rssa.12056.
- 503 Knack, Stephen. 1994. "Does Rain Help the Republicans? Theory and Evidence on Turnout
- and the Vote." *Public Choice* 79: 189–204.
- Kousser, Thad, and Megan Mullin. 2007. "Does Voting by Mail Increase Participation?
- Using Matching to Analyze a Natural Experiment." Political Analysis 15 (4): 428–45.
- http://www.jstor.org/stable/25791905.
- Lasala-Blanco, Narayani, Robert Shapiro, and Viviana Rivera-Burgos. 2017. "Turnout
- and Weather Disruptions: Survey Evidence from the 2012 Presidential Elections in the

- Aftermath of Hurricane Sandy." *Electoral Studies* 45: 141–52.
- Leighley, Jan, and Jonathan Nagler. 2014. Who Votes Now? Demographics, Issues, In-
- equality, and Turnout in the United States. Princeton: Princeton University Press.
- Mann, Michael E., and Kerry A. Emanuel. 2006. "Atlantic Hurricane Trends Linked to
- Climate Change." Eos, Transactions American Geophysical Union 87 (24): 233–41.
- https://doi.org/10.1029/2006EO240001.
- McDonald, Zack. 2018. "Bay Voters Getting 5 'Mega Voting' Sites." Panama City News
- Herald, October 23, 2018. https://www.newsherald.com/news/20181023/bay-voters-
- getting-5-mega-voting-sites.
- McNulty, John, Conor Dowling, and Margaret Ariotti. 2009. "Driving Saints to Sin: How
- Increasing the Difficulty of Voting Dissuades Even the Most Motivated Voters." *Political*
- *Analysis* 17 (4): 435–55.
- Merrifield, John. 1993. "The Institutional and Political Factors That Influence Voter
- Turnout." Public Choice 77: 657–67.
- Morris, Kevin, and Peter Miller. 2020. "Voting in a Pandemic: COVID-19 and Primary
- Turnout in Milwaukee, Wisconsin." SSRN Scholarly Paper ID 3634058. Rochester, NY:
- Social Science Research Network. https://doi.org/10.2139/ssrn.3634058.
- Parks, Miles. 2018. "After Hurricane Michael, Voting 'Is the Last Thing on Their Minds."
- 528 NPR. org, October 25, 2018. https://www.npr.org/2018/10/25/659819848/after-
- hurricane-michael-voting-is-the-last-thing-on-their-minds.
- Persson, Mikael, Anders Sundell, and Richard Öhrvall. 2014. "Does Election Day Weather
- Affect Voter Turnout? Evidence from Swedish Elections." *Electoral Studies* 33: 335–42.
- 532 Sekhon, Jasjeet S. 2011. "Multivariate and Propensity Score Matching Software with Au-
- tomated Balance Optimization: The Matching Package for R." Journal of Statistical
- Software 42 (1): 1–52. https://doi.org/10.18637/jss.v042.i07.

- Shachar, Ron, and Barry Nalebuff. 1999. "Follow the Leader: Theory and Evidence on Political Participation." *American Economic Review* 89 (3): 525–47.
- Sinclair, Betsy, Thad E. Hall, and R. Michael Alvarez. 2011. "Flooding the Vote: Hurricane
- Katrina and Voter Participation in New Orleans." American Politics Research 39 (5):
- 921–57. https://doi.org/10.1177/1532673X10386709.
- 540 Stein, Robert. 2015. "Election Administration During National Disasters and Emergencies:
- Hurricane Sandy and the 2012 Election." Election Law Journal 14: 66–73.
- 542 Stein, Robert M., and Greg Vonnahme. 2008. "Engaging the Unengaged Voter: Vote Centers
- and Voter Turnout." The Journal of Politics 70 (2): 487–97. https://doi.org/10.1017/
- s0022381608080456.
- Thomas, Rachel, and Jennifer Sangalang. 2018. "How Big Is Hurricane Michael?" TC-
- Palm, October 10, 2018. https://www.tcpalm.com/story/weather/hurricanes/2018/10/
- 10/how-big-hurricane-michael/1587167002/.
- Vasquez, Savannah. 2018. "HURRICANE MICHAEL: How to Vote in Gulf County."
- The Star, October 18, 2018. https://www.starfl.com/news/20181018/hurricane-michael-
- how-to-vote-in-gulf-county.
- Vielkind, Jimmy. 2020. "New Yorkers Can Vote by Absentee Ballot Because of Coronavirus."
- Wall Street Journal: US, April 8, 2020. https://www.wsj.com/articles/new-yorkers-can-
- vote-by-absentee-ballot-because-of-coronavirus-11586385420.
- Walker, Hannah L., Michael C. Herron, and Daniel A. Smith. 2019. "Early Voting Changes
- and Voter Turnout: North Carolina in the 2016 General Election." Political Behavior 41
- (4): 841–69. https://doi.org/10.1007/s11109-018-9473-5.
- 557 WJHG Panama City. 2018. "Bay County Hurricane Michael Recovery Information,"
- October 31, 2018. https://www.wjhg.com/content/news/Bay-County-498037961.html.