

Mixed Modes of Data Collection and Administration and New Sources of Samples in the US 2020 Election. How Did They Fare?

**By Claire Durand,
Université de Montréal,**

**With Timothy P. Johnson, UIC &
Luis P. Peña Ibarra, Université de Montréal**

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Outline

- ✦ Do polls using mixed mode perform differently and better than other polls?
 - ✦ On average?
 - ✦ In trends?
- ✦ Analysis:
 - ✦ Estimates of trends: local regression
 - ✦ Statistical validation: multilevel analysis
- ✦ In-depth focus on poll performance: last 10 days
 - ✦ Mixed modes and new sampling sources
- ✦ A revised model.
- ✦ Conclusion

Modes and estimates

- ✦ Modes of administration may differ
 - ✦ Because of the social context in which surveys are conducted
 - ✦ Because of the sampling frame or source that differ according to modes.
- ✦ Durand & Johnson (2021) conclude to an impact of mode that varies with election, not always in the same direction.
 - ✦ In 15 elections and referendums, in 4 countries.
- ✦ Clinton et al. (2021) AAPOR Task Force... conclude to the absence of substantial mode effects while...
- ✦ Silver (2021) concludes that “The best polls... use a various and sundry mix of methods (online, IVR, text messaging)”.

Literature on the 2020 US election polls

+Before the election:

- + McKinney, Azem & Smith (2020) focus on Spiral of silence & Granite State polls;
- + Dropp & al. (2020) focus on Shy Trump (Morning Consult).

+After the election:

- + Cohn (2020) focus on Siena Polls; hypothesizes that turnout of different groups is badly estimated.
- + Keeter et al. (2020). Weighting for 2016 vote recall did not work.
- + Smalley & Wolfe (2021) do not include IVR polls;
- + Shino, Martinez & Binder (2022) experiment using dual-mode in Florida. Survey mode significant.
- + Guzman Castillo & al. (2020). Summary of multiple post-mortem.

Data

✦ 222 polls conducted from September 1st 2020 to election day, by 51 pollsters.

	Pollsters		Polls	
	N	%	N	%
IVR	2	4	11	5
Web Opt-in	26	51	131	59
Live Phone	13	25	33	15
Other (Web prob, mobile, Mturk, RDE)	10	20	47	21
Mixed-mode use	10	20	36	16
Total	51	100	222	100

✦ Average of 4.3 polls by pollster

✦ Web Opt-in pollsters: 5.0

✦ Live phone pollsters: 2.5

✦ IVR pollsters: 5.5

Methodological features of polls & pollsters

+ Polls:

- + Period when the poll was conducted
- + No. days in the field
- + Margin of error/ credibility interval
- + *Use of a likely voter model*

+ Pollsters:

- + No. Surveys conducted during the campaign ~ pollster experience
- + Use of Mixed mode
- + Use of Web Opt-in Panel as main mode.
- + *538 pollster ratings, average error and expected error*

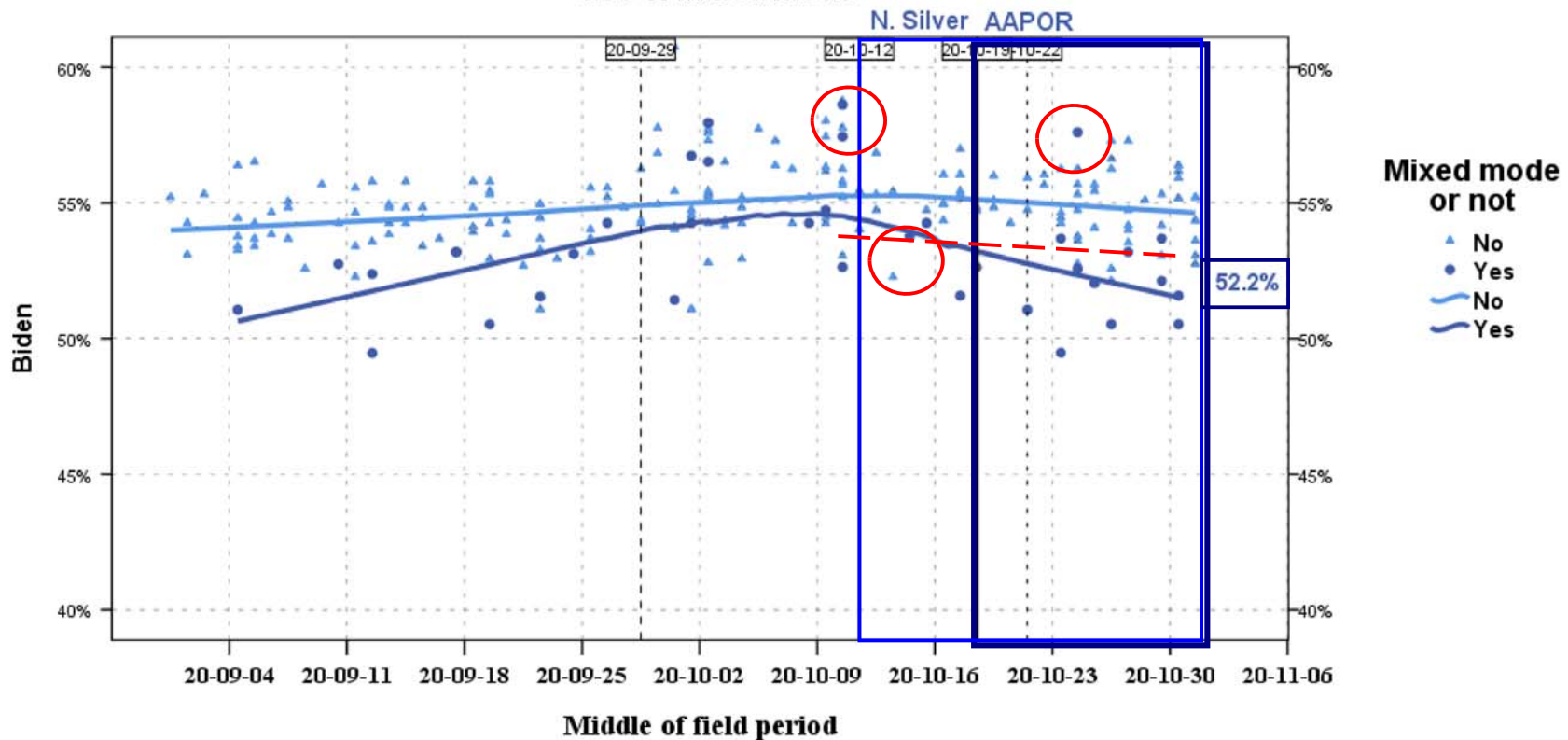
Analysis

- ✦ Dependent variable: At the national level
Difference bw Estimates and Election results:
 $\text{Biden}/(\text{Biden}+\text{Trump})$
- ✦ 1. Visualize the trends according to use of mixed mode: *local regression*
- ✦ 2. Validate differences between trends statistically: *multilevel analysis* with polls nested within pollsters
 - ✦ Controlling for relevant methodological features
 - ✦ At the poll level
 - ✦ At the pollster level
- ✦ 3. More in-depth: the last 10 days.
- ✦ 4. Revised model: multilevel analysis

Are trends similar according to mixed mode use?

No

Proportional support for Biden (on 2-candidate share) from September 1st, 2020 - according to the use of mixed mode



Each point represents a poll estimate positioned at the middle of the field work. Lines represent Loess estimates of change over time using Epanechnikov .65 estimation. The two vertical dotted lines represent the debates. The two continuous lines represent the periods of analysis of N. Silver and AAPOR task force © C. Durand, 2020.

Explaining variance between polls

Table 1. Basic Models

	Model 0	Model 0 longit.	Poll level	Pollster level	Polls&pollsters	Interaction	Parsimonious Mixed
<i>Intercept</i>	2.469 ***	2.690 ***	1.928 ***	2.876 ***	1.957 **	1.866 *	2.711 ***
Poll level							
Time centered		0.045 ***	0.047 ***	0.045 ***	0.047 ***	0.041 ***	0.046 ***
- Mixed						0.037	
Time centered ² (*100)		0.098 *	-0.092 *	-0.100 *	-0.094 *	-0.053	-0.056
- Mixed						0.002 **	-0.002 *
Time centered ³ (*1000)		-0.043 ***	-0.043 ***	-0.043 ***	-0.044 ***	-0.033	-0.043 ***
- Mixed						-0.054	
Nbdays in field			0.051 ‡		0.057 ‡	0.051	
Moe Biden			0.295		0.329	0.334 ‡	
Likely voter			-0.387		-0.401	-0.482 ‡	
Pollsters level							
Nb polls since sept				-0.014	0.002	0.005	
Mixte				-0.824	-0.901	-0.242	-0.161
Web Opt-in				0.117	0.084	0.079	
Variance Poll level	1.491	1.261	1.261	1.269	1.271	1.183	1.197
Variance Pollster level	1.837	1.776	1.587	1.599	1.391	1.426	1.637
Part of var. at pollster level	55.2%	58.5%	55.7%	55.8%	52.3%	54.7%	57.7%
Compared with model 0 long.							
<i>Explained var at poll level</i>		15.4% comp. 0	0.0%	-0.6%	-0.8%	6.2%	5.0%
Deviance	797.478	765.335	761.138	762.447	757.628	745.192	752.717
Nb parameters	3	6	9	9	12	15	8

Results

- ✦ Model 0 without predictors:
 - ✦ 55% of the variance in polls occurs between pollsters.
- ✦ Time components -- linear, quadratic & cubic -
-explains are all significant. They explain
 - ✦ 15% of the between poll variance
- ✦ None of the other predictors at the poll or pollster level is significant.
 - ✦ No. days poll was in the field (marginally sig.), MOE, likely voter)
 - ✦ No. polls conducted, Mixed, Web Opt-in

Final Model

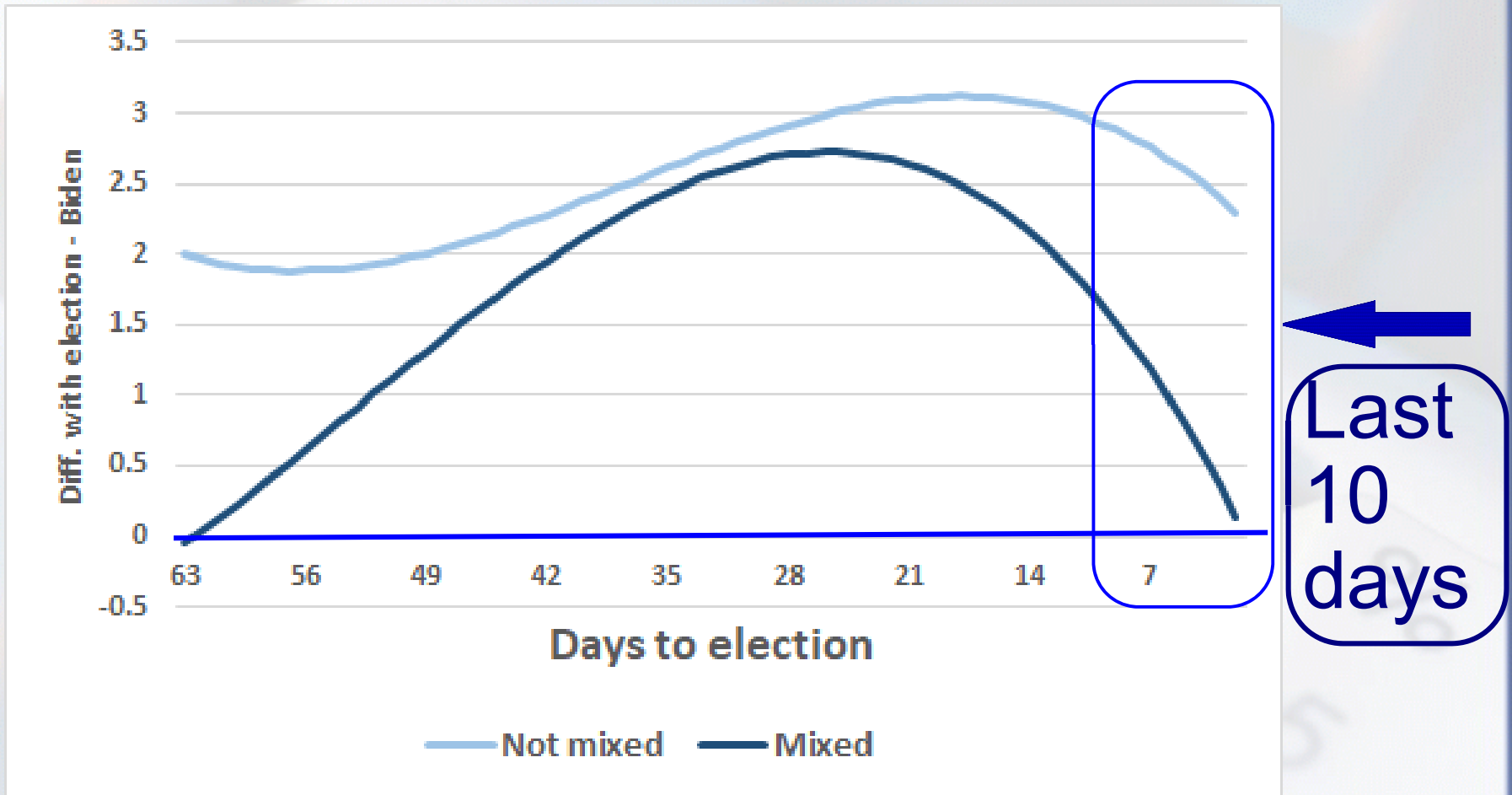
Adding interaction between use of mixed mode and time components

- + A) The impact of mixed mode use **on the time components**
 - + **Is significant for the quadratic trend**
 - + Compared with the model with time components only,
 - + explained variance at the poll level: 6%
- + B) Parsimonious model
 - + **Only the impact of the use of mixed mode on the quadratic trend is kept in the model**
 - + Explained variance at poll level: 5%
 - + No significant difference bw models B and C.

Which means

- ✦ Multilevel analysis, controlling for the dependency of polls on pollsters...
- ✦ ... Confirms that the main difference between polls using mixed mode and other polls is:
- ✦ ... A different estimation of change over time:
 - ✦ Almost no change during the campaign for non mixed polls
 - ✦ A quadratic trend -- support for Biden increases until mid-campaign and then decreases -- for polls using mixed mode .
 - ✦ **Which can be visualized by the following graph.**

Error in support for Biden according to the use of mixed mode



Focus on the last 10 days

Pollsters and Polls - last 10 days

Main mode	Pollsters	Polls	Within MOE	Mixed mode	Within 1 point	Mixed mode	Outside MOE	Mixed mode
Web	22	35	22	3	10	3	13	1
Live phone	8	8	5	2	2	2	3	0
IVR	2	3	3	3	1	1	0	0
Total	32	46	30	8	13	6	16	1

Note: 27% of within MOE polls use mixed mode compared to 6% of outside MOE polls

- ✦ Among the 46 poll estimates,
 - ✦ 30 are within the MOE of end results, 8 (27%) of them are mixed mode
 - ✦ **Of the 13 estimates** within 1 point difference of the end results, **half (6)** are mixed mode.
 - ✦ One estimate outside the MOE is mixed mode

Last 10 days: within MOE & within 1 point of final results

Table 2. Most precise predictions - last 10 days - for Biden (52.2%) within MOE & less than one point difference

538		Start date	End date	Sample size	Estimate Biden/ (Trump+ Biden)	Difference with final results	Mixed mode?	2nd mode	Comment
	IVR polls (1 out of 3 polls)								
B	Gravis	27-oct	29-oct	1281	53.2	1.0	Yes	Web (?%)	
	Telephone polls (2 out of 8 polls)								
A+	IBD/TIPP	27-oct	31-oct	1072	52.1	-0.1	Yes	Web (37%)	tracking
A+	IBD/TIPP	28-oct	01-nov	1072	51.6	-0.6	Yes	Web (37%)	tracking
	Web polls (10 out of 35 polls)								
B-	RMG Research ¹	23-oct	24-oct	1842	52.1	-0.1	Yes	IVR (10%)	RDE
B-	RMG Research ¹	29-oct	31-oct	1200	52.6	0.4	Yes	IVR (10%)	RDE
A-	Emerson College	25-oct	26-oct	1121	52.0	-0.2	Yes	IVR (36%)	mult. sources
x A/B	Winston	23-oct	26-oct	1000	52.8	0.6	No		
x C	Swayable	23-oct	26-oct	11714	52.6	0.4	No		RDE similar
x C	Swayable	29-oct	31-oct	3115	53.1	0.9	No		RDE similar
x C	Swayable	01-nov	01-nov	5174	53.1	0.9	No		RDE similar
x B+	Harris	25-oct	28-oct	2093	52.1	-0.1	No		Propensity score
A	Atlas Intel	26-oct	28-oct	1726	52.6	0.4	No		Propensity score
B-	Zogby	01-nov	01-nov	1008	52.8	0.5	No		
	1: Hypothesis of high participation by Republicans								

- ✦ 6 are mixed mode, all of IVR & live phone
- ✦ Among web polls, 3 are mixed mode and half do not use a Web Opt-in panel.

Last 10 days: within MOE but more than 1 point diff. of final results

538 Table 3. Best predictions - last 10 days - for Biden (52.2%) within MOE, more than one point difference

		Start date	End date	Sample size	Estimate Biden/ (Trump+ Biden)	Difference with final results	Mixed mode?	2nd mode	Comment
IVR polls (+2 out of 3 polls)									
B	Pulse Opinion Research	26-oct	28-oct	1500	50.5	-1.7	Yes	Web (?%)	
B	Pulse Opinion Research	28-oct	01-nov	1500	50.5	-1.7	Yes	Web (?%)	
Telephone polls (+3 out of 8 polls)									
B+	Suffolk University	23-oct	27-oct	1000	53.8	1.6	No		
B/C	Beacon	27-oct	29-oct	1246	54.2	2.0	No		
B+	NBC/WSJ (Hart)	29-oct	31-oct	833	55.3	3.1	No		
Web polls (+12 out of 35 polls)									
C	Swayable	27-oct	28-oct	2386	53.5	1.3	No		RDE similar
B-	Lucid (Tufts U)	25-oct	25-oct	837	53.6	1.4	No		Mult. Sources
B-	Ipsos	31-oct	02-nov	914	53.6	1.4	No		Mult. Sources
B-	Ipsos	23-oct	27-oct	825	55.3	3.1	No		Mult. Sources
B+	HarrisX	27-oct	28-oct	2093	54.0	1.8	No		Propensity scores
B+	Angus Reid Global	23-oct	28-oct	2231	54.1	1.9	No		Web Opt-in
A	Survey USA	29-oct	31-oct	1265	54.2	2.0	No		WT voter recall
B-	Change Research	23-oct	24-oct	1125	54.3	2.1	No		WT voter recall
B/C	Léger	29-oct	01-nov	1000	54.3	2.1	No		Web Opt-in
B/C	Léger	23-oct	25-oct	834	54.4	2.2	No		Web Opt-in
B-	Research Co	31-oct	02-nov	1100	54.3	2.1	No		
B/C	AYTM	30-oct	31-oct	700	55.2	3.0	No		

+2 are mixed mode, all IVR polls

+ Among web & live phone, none are mixed mode, one use RDE (Random Device Engagement) or similar sampling, 3 multiple sources, 2 weight by voter recall

Last 10 days: outside MOE

538 **Table 4. Predictions outside MOE - last 10 days - for Biden (52.2%)**

		Start date	End date	Sample size	Estimate Biden/ (Trump+ Biden)	Difference with final results	Mixed mode?	2nd mode	Comment
IVR polls (0 out of 3 polls)									
Telephone polls (+3 out of 8 polls)									
B/C	Global Marketing Research	23-oct	27-oct	1006	57.6	5.4	Yes	Web	
A-	Quinnipiac University	28-oct	01-nov	1516	56.2	4.0	No		
C	SSRS	23-oct	26-oct	886	56.2	4.0	No		
Web polls (+13 out of 35 polls)									
C	Data for Progress	28-oct	29-oct	1403	55.1	2.9	No		WT voter recall
B/C	J.L. Partners	26-oct	28-oct	844	57.3	5.1	No		WT voter recall
B	Morning Consult	24-oct	26-oct	12000	55.3	3.1	No		WT voter recall
B	Morning Consult	27-oct	29-oct	12000	54.7	2.5	No		WT voter recall
B/C	Opinium	26-oct	29-oct	1451	57.3	5.1	No		WT voter recall
B/C	Qriously Brandwatch	29-oct	01-nov	3505	55.9	3.7	No		WT voter recall
B/C	Redfield and Wilton Strategies	25-oct	26-oct	4790	55.4	3.2	No		WT voter recall
B/C	Redfield and Wilton Strategies	30-oct	01-nov	8765	56.4	4.2	No		WT voter recall
C	Survey Monkey	26-oct	27-oct	1573	56.6	4.4	No		WT voter recall
B+	YouGov	23-oct	25-oct	1350	56.2	4.0	No		Web Opt-in
B+	YouGov	25-oct	27-oct	1365	55.7	3.5	No		Web Opt-in
B+	YouGov	30-oct	01-nov	1360	55.2	3.0	No		Web Opt-in
B+	YouGov	31-oct	02-nov	1363	55.2	3.0	No		Web Opt-in

✦ 1 live phone poll is mixed mode

✦ Most web polls use Web opt-in panels as their unique mode; most adjust using voter recall.

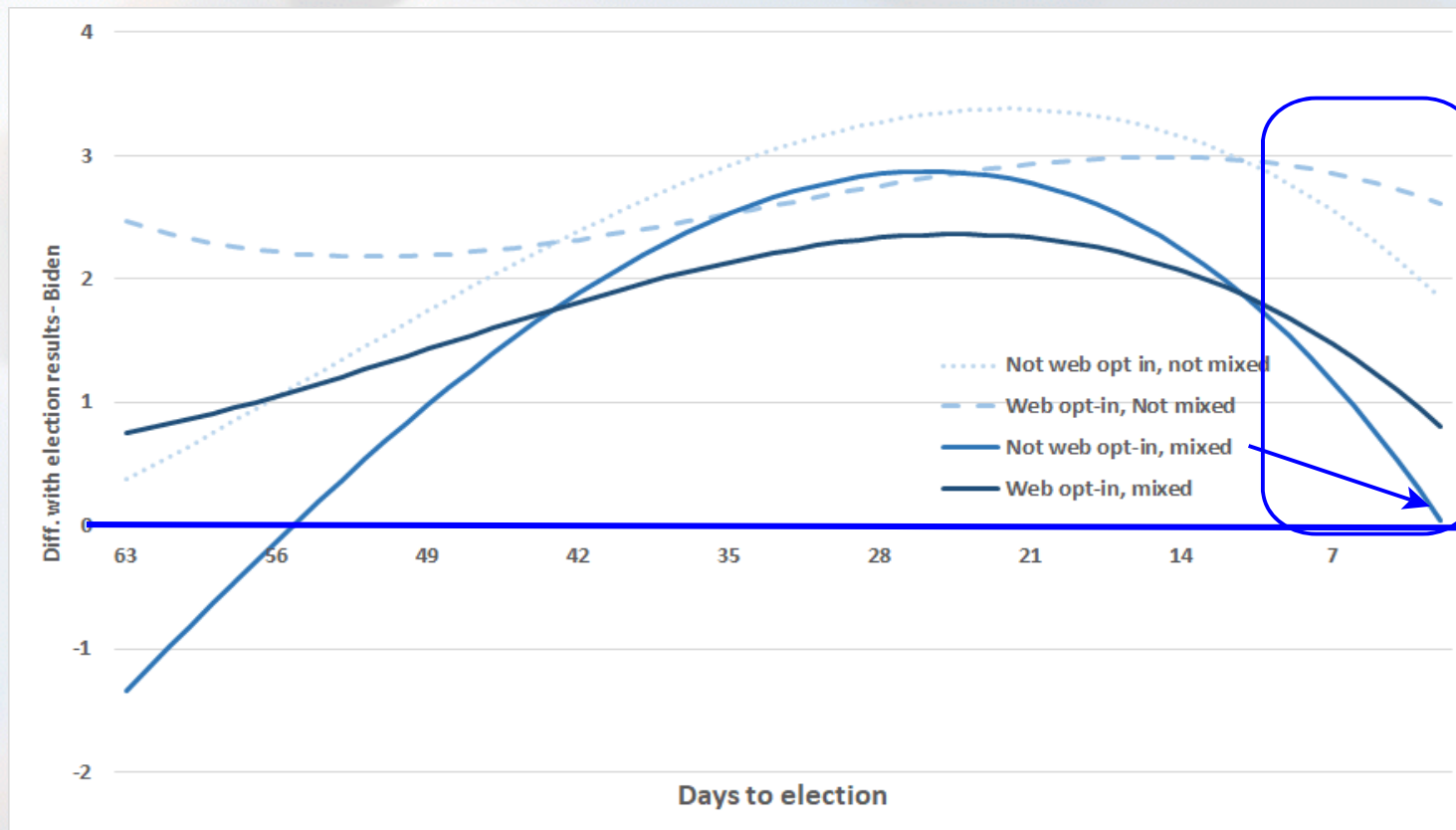
This leads to a revised model

Table 5. Revised Models

	Parsimonious Mixed	Revised Web Opt in only	Revised Mixed+Web Opt-in
<i>Intercept</i>	2.711 ***	2.938 ***	3.045 ***
Poll level			
Time centered	0.046 ***	0.043 ***	0.057 ***
- Mixed			
Time centered ² (*100)	-0.056	-0.002 ***	-0.002
- Mixed	-0.002 *		-0.001 *
- Web Opt-In		0.002 ***	0.002 ***
Time centered ³ (*1000)	-0.043 ***	0.000 **	-0.033 *
- Mixed			
Pollsters level			
Mixed	-0.161		-0.386
Web Opt-in		-0.365	-0.449
Variance Poll level	1.197	1.171	1.110
Variance Pollster level	1.637	1.739	1.668
Part of var. at pollster level	57.7%	59.8%	60.0%
Compared with model 0 long.			
<i>Explained var at poll level</i>	5.0%	7.1%	12.0%
Deviance	752.717	751.033	739.524
Nb parameters	8	8	11

- ✦ The best model (difference in deviance of 13,2 with 3 df with parsimonious) is a model adding:
 - ✦ Absence of use of Web Opt-in as main mode on estimates.
- ✦ Explained variance:
 - ✦ 12% at poll level.

Support for Biden according to the use of mixed mode and of Web Opt-in



Not
Mixed
mode

Mixed
mode

Mixed mode always performs best, even more when no use of Web Opt-in panels

Limitations

- ✦ The small number of 51 pollsters limits the possibilities of analysis.
- ✦ It is quite difficult in many cases to find all the relevant methodological information.
- ✦ Pollsters use all kinds of “modelling” and weighting strategies that we don’t know of and that may impact their performance, for instance,...
- ✦ Related to turnout in different groups:
 - ✦ White non college-educated
 - ✦ Blacks and Latinos,
 - ✦ Defined by partisan id.

Conclusion

- ✦ Two-thirds of the poll estimates of the last 10 days (30/46, 65%) were within MOE.
- ✦ Mixed mode polls trace a different trend of support and lead to a better forecast of the end results.
- ✦ Among the best performing polls, new practices in sampling or weighting have appeared in Web polls:
 - ✦ Multiple sampling sources, Random Device Engagement (RDE), Use of propensity scores,...
- ✦ We will need to examine these practices closely to understand why they tend to perform better.

Recommendation to AAPOR, and other interested parties...

- **Propose a task force to look into new ways of collecting samples in web surveys**
- **Work with media and pollsters to agree on a “template” for methodological reporting suggesting**
 - *which methodological information should be provided and*
 - *how to present it to the public*
- **In order to better inform the public and**
- **allow for a much easier monitoring and analysis of methodological innovation**