## Credit Shocks and Populism

### Preliminary Draft: Please do not Circulate

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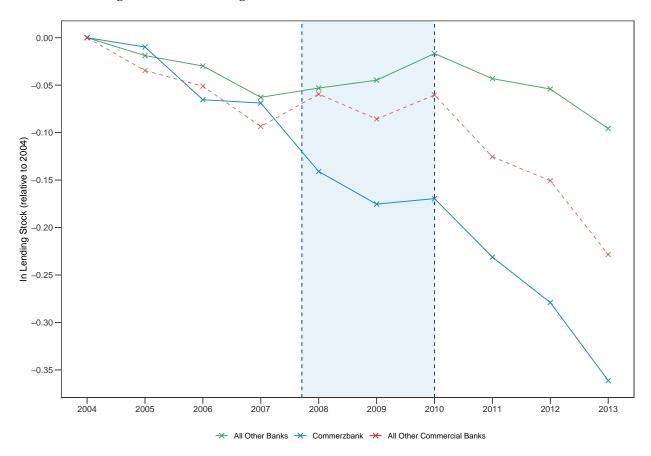
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Figure 1: The Lending Stock of German Banks: Commerzbank vs. All



**Notes:** The graph shows the ln lending stock to German non-financial customers, relative to the year 2004, in 2010 billions of euros. Data for Commerzbank include lending by branches of Commerzbank and Dresdner bank, summing their lending stock for the years before 2009 Dresdner Bank's take-over, using information from the annual reports. For all other banks, data come from Deutsche Bundesbank on German banks and subtract lending by Commerzbank. For all other commercial banks, lending stock of Commerzbank, the savings banks, the Landesbanken, and the cooperative banks is removed. Replication from data and calculation in Huber (2018). We thank Kilian Huber for kindly share the information with us.

Table 1: Summary Statistics

	Mean	SD	Median	Min	Max	Non-Missing Obs
Panel A: Demographic Variables						
Male	0.484	0.500	0.000	0.000	1.000	416,493
Birth Year	1,958.064	19.006	1,959.000	1,902.000	2,000.000	416,49
Age	50.371	18.540	50.000	16.000	105.000	416,49
Residence in GDR in 1989	0.208	0.406	0.000	0.000	1.000	410,57
Married	0.540	0.498	1.000	0.000	1.000	414,60
Direct/Indirect Migrant	0.174	0.379	0.000	0.000	1.000	416,49
Panel B: Education						
Vocational Degree or Higher	0.862	0.345	1.000	0.000	1.000	407,39
University Degree	0.187	0.390	0.000	0.000	1.000	407,39
Years of Education	11.952	2.560	11.500	7.000	18.000	398,22
Panel C: Occupational Status						
Currently Unemployed	0.065	0.246	0.000	0.000	1.000	409,05
In Working Age	0.740	0.439	1.000	0.000	1.000	416,49
In Labour Force	0.807	0.395	1.000	0.000	1.000	332,36
Self-Employed	0.031	0.174	0.000	0.000	1.000	416,49
In Education	0.040	0.197	0.000	0.000	1.000	416,49
Retired	0.046	0.209	0.000	0.000	1.000	416,49
EGP Score (Job Prestige Scale)	4.710	3.025	4.000	1.000	11.000	301,72
Contractual Working Hours per Week	34.249	9.601	38.500	0.300	80.000	191,31
Officially Unemployed Prev. Yr. No. Months	0.916	2.889	0.000	0.000	12.000	332,35
Monthly Gross Earnings (in 2016 EUR)	1,954.152	2,278.426	1,609.442	0.000	1.63e+05	332,36
Panel D: Household Variables						
Household Size	1.934	0.847	2.000	1.000	10.000	416,49
Number of Children in HH	0.411	0.814	0.000	0.000	11.000	416,49
Home-Ownership	0.488	0.500	0.000	0.000	1.000	409,79
Presence of Outstanding Loans	0.357	0.479	0.000	0.000	1.000	409,55
Annual Household Disposable Income (in 2016 EUR)	22045.461	19852.624	20247.000	-8.63e+04	8.38e+05	416,49
Panel E: County-Level Variables						
County GDP (in 2016 mln EUR)	7.129	10.960	4.375	1.009	139.831	7,15
County GDP per capita (in 2016 EUR)	32418.014	14219.515	28785.982	13772.455	1.81e+05	7,15
Population (1000 units)	205.681	231.220	151.546	33.944	3,613.495	7,15
Population Density (units/km2)	523.811	678.680	199.596	36.129	4,712.758	7,15
Unemployment Rate	7.970	4.256	7.000	1.200	25.400	7,15
Average Household Income (in 2016 EUR)	1,734.457	229.053	1,720.812	1,246.867	3,498.927	7,15
Share of Foreigners	7.607	4.734	6.800	0.600	35.000	7,15
County of Former GDR	0.190	0.392	0.000	0.000	1.000	7,15
Panel G: Variable of Interest						
County-Level Commerzbank Exposure	0.083	0.043	0.075	0.008	0.241	7,15
Panel F: Outcome Variables						
Intention to Vote for Populist Party	0.033	0.180	0.000	0.000	1.000	385,24
Political Supporter	0.453	0.498	0.000	0.000	1.000	385,24
Banking and Financial Crisis Index (sLDA)	3.181	0.270	3.208	2.357	3.745	161,68
Populism Index (sLDA)	0.090	0.024	0.089	0.043	0.227	161,68

Table 2: The Effect of the Credit Shock on Political Support: Difference-in-Differences Results

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
$Exposure_k \times Post$	0.768	0.901**	0.703	0.728*	0.817*	0.755**	0.757**	0.980**
	(0.481)	(0.419)	(0.435)	(0.426)	(0.472)	(0.356)	(0.355)	(0.483)
Number of Observations	385,248	362,246	325,947	325,947	325,947	314,765	314,765	314,765
Number of Counties	401	401	400	400	400	400	400	400
Outcome Mean (%)	45.349	45.944	44.918	44.918	44.918	45.085	45.09	45.085
$sd\left(Exposure_{k}\right)\left(\%\right)$	4.742	4.739	4.723	4.723	4.723	4.721	4.723	4.721
Within $R^2$	0.000	0.087	0.088	0.088	0.087	0.000	0.000	0.000
County-Level FE	Yes							
Wave FE	Yes							
Individual FE	No	No	No	No	No	Yes	Yes	Yes
Individual Controls	No	Yes						
Household Controls	No	No	Yes	Yes	Yes	Yes	Yes	Yes
Regional Controls	No	No	No	Yes	No	No	Yes	No
County Time Trends	No	No	No	No	Yes	No	No	Yes

Table 3: The Effect of the Credit Shock on Intention to Vote for a Populist Party: Difference-in-Differences Results

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
$Exposure_k \times Post$	0.399**	0.490***	0.510***	0.534***	0.457***	0.577***	0.594***	0.613***
	(0.174)	(0.189)	(0.146)	(0.147)	(0.145)	(0.193)	(0.187)	(0.172)
Number of Observations	385,248	362,246	325,947	325,947	325,947	314,765	314,765	314,765
Number of Counties	401	401	400	400	400	400	400	400
Outcome Mean (%)	3.347	3.371	3.161	3.161	3.161	3.139	3.138	3.139
$sd\left(Exposure_{k}\right)$ (%)	4.742	4.739	4.723	4.723	4.723	4.721	4.723	4.721
Within $R^2$	0.000	0.009	0.010	0.011	0.010	0.001	0.001	0.000
County-Level FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Wave FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Individual FE	No	No	No	No	No	Yes	Yes	Yes
Individual Controls	No	Yes						
Household Controls	No	No	Yes	Yes	Yes	Yes	Yes	Yes
Regional Controls	No	No	No	Yes	No	No	Yes	No
County Time Trends	No	No	No	No	Yes	No	No	Yes

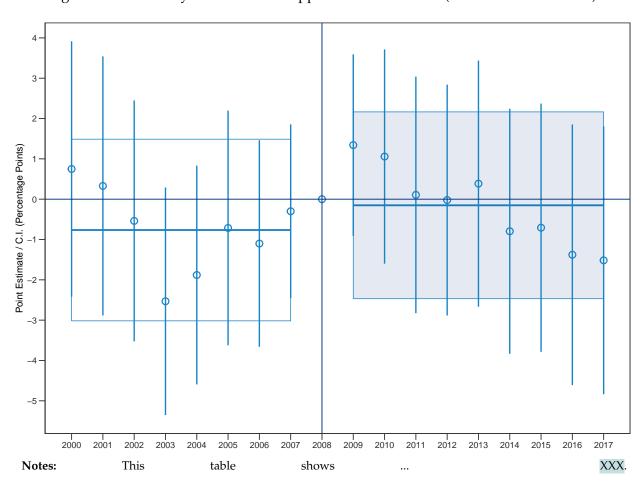
Table 4: The Effect of the Credit Shock on Political Support: Difference-in-Differences with Binary Treatment

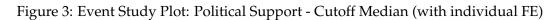
	Med	dian	75	ith	90	th	25th -	- 75th	10th – 90th	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
$D_{kt}$	0.526	1.279	0.965	1.191	2.420*	2.014**	2.059	1.885	2.560	2.307
	(0.917)	(0.801)	(1.113)	(0.854)	(1.348)	(0.910)	(1.321)	(1.144)	(1.825)	(1.591)
Number of Observations	325,947	314,765	325,947	314,765	325,947	314,765	158,103	152,053	61,899	59,469
Number of Counties	400	400	400	400	400	400	199	199	79	79
Outcome Mean (%)	44.918	45.09	44.918	45.09	44.918	45.09	45.421	45.645	46.521	46.638
Treatment Assignment (%)	8.908	8.908	13.259	13.259	16.684	16.684	5.658	5.658	3.969	3.969
Within $R^2$	0.088	0.000	0.088	0.000	0.088	0.000	0.090	0.001	0.105	0.001
County-Level FE	Yes	Yes								
Wave FE	Yes	Yes								
Individual FE	No	Yes	No	Yes	No	Yes	No	Yes	No	Yes
Individual Controls	Yes	Yes								
Household Controls	Yes	Yes								
Regional Controls	Yes	Yes								
County Time Trends	No	No								

Table 5: The Effect of the Credit Shock on Intention to Vote for a Populist Party: Difference-in-Differences with Binary Treatment

	Med	dian	75	75th		th	25th	– 75th	10th - 90th	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
$D_{kt}$	1.010***	1.115***	0.769*	1.300**	1.102***	1.065	1.023**	1.643***	1.017*	1.441*
	(0.321)	(0.353)	(0.427)	(0.509)	(0.406)	(0.805)	(0.461)	(0.535)	(0.604)	(0.806)
Number of Observations	325,947	314,765	325,947	314,765	325,947	314,765	158,103	152,053	61,899	59,469
Number of Counties	400	400	400	400	400	400	199	199	79	79
Outcome Mean (%)	3.161	3.138	3.161	3.138	3.161	3.138	3.27	3.248	3.27	3.208
Treatment Assignment (%)	8.908	8.908	13.259	13.259	16.684	16.684	5.658	5.658	3.969	3.969
Within $R^2$	0.010	0.001	0.010	0.001	0.010	0.000	0.014	0.001	0.027	0.001
County-Level FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Wave FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Individual FE	No	Yes	No	Yes	No	Yes	No	Yes	No	Yes
Individual Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Household Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Regional Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
County Time Trends	No	No	No	No	No	No	No	No	No	No

Figure 2: Event Study Plot: Political Support - Cutoff Median (without individual FE)





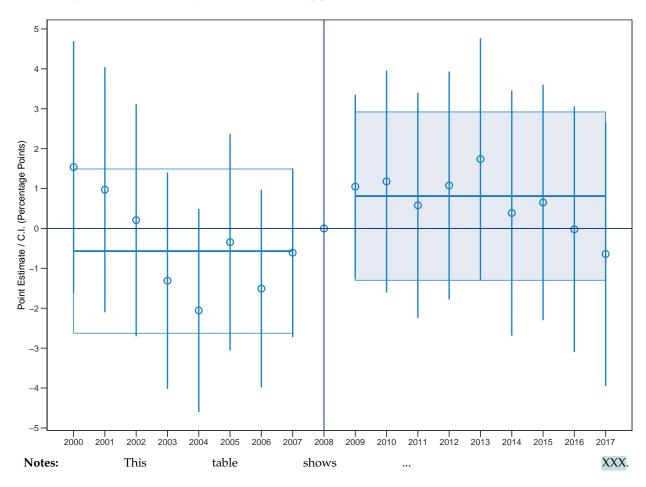


Figure 4: Event Study Plot: Populist Party - Cutoff Median (without individual FE)

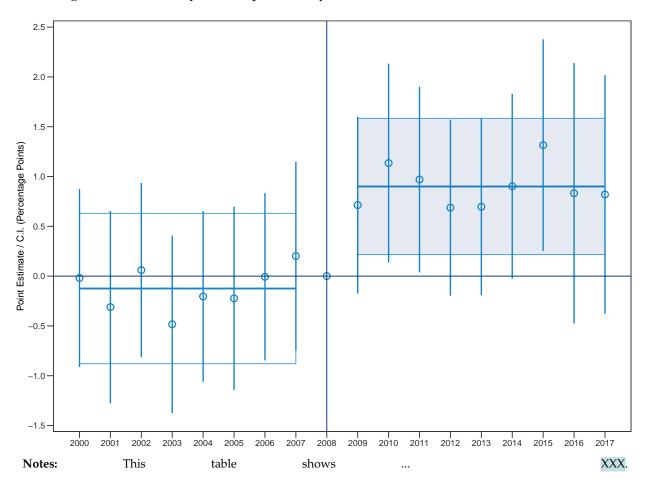


Figure 5: Event Study Plot: Populist Party - Cutoff Median (with individual FE)

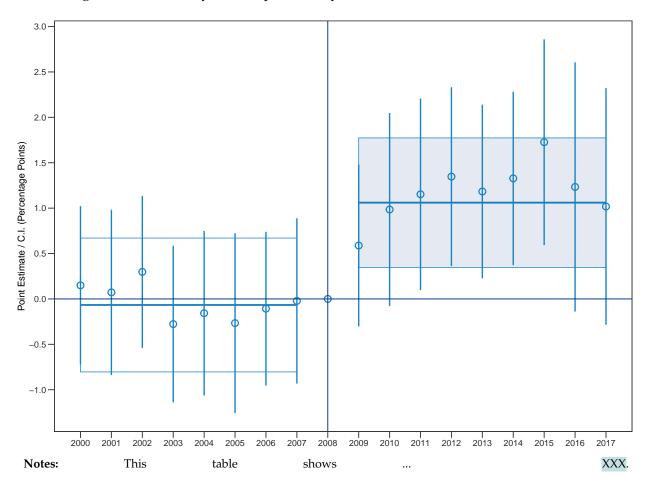


Figure 6: Event Study Plot: Political Support - Cutoff 75<sup>th</sup> Percentile (without individual FE)

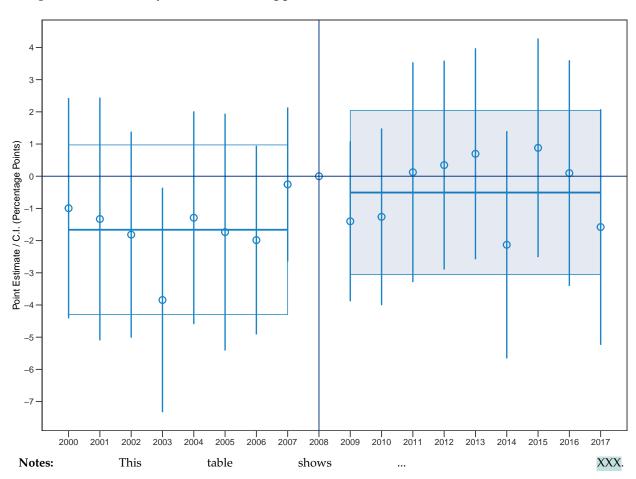


Figure 7: Event Study Plot: Political Support - Cutoff 75<sup>th</sup> Percentile (with individual FE)

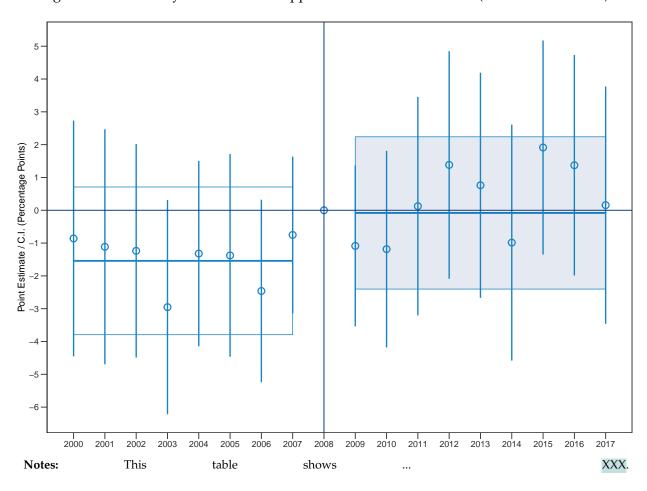


Figure 8: Event Study Plot: Populist Party - Cutoff 75<sup>th</sup> Percentile (without individual FE)

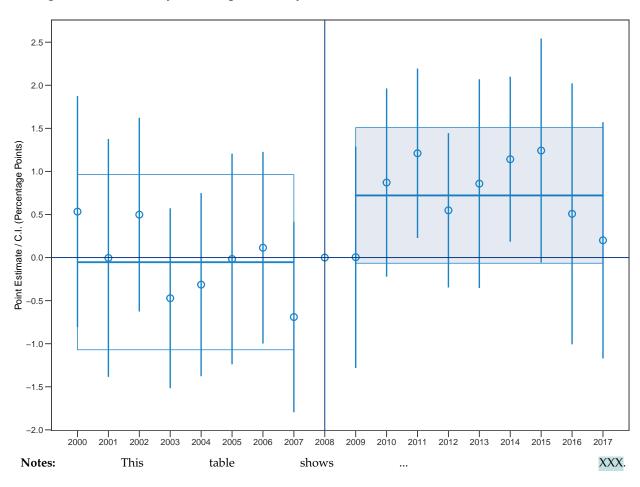


Figure 9: Event Study Plot: Populist Party - Cutoff 75<sup>th</sup> Percentile (with individual FE)

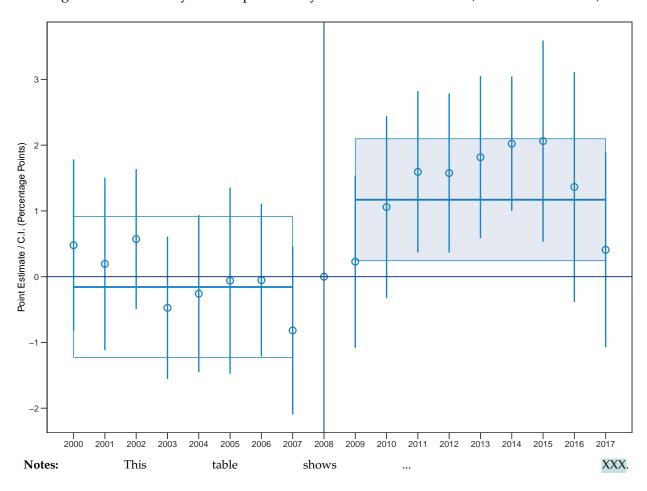


Figure 10: Event Study Plot: Political Support - Cutoff 90<sup>th</sup> Percentile (without individual FE)

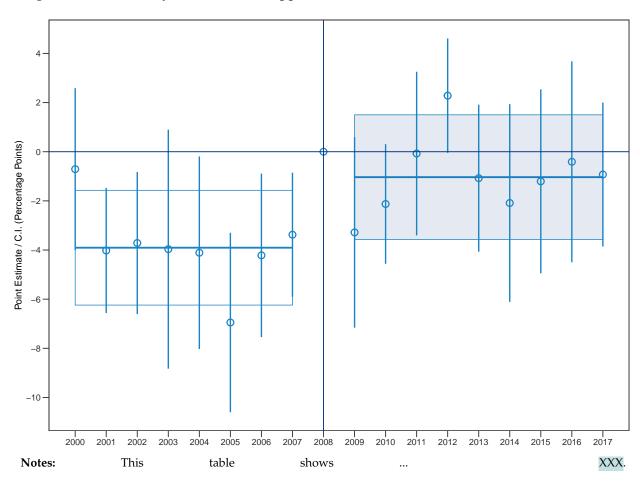


Figure 11: Event Study Plot: Political Support - Cutoff 90<sup>th</sup> Percentile (with individual FE)

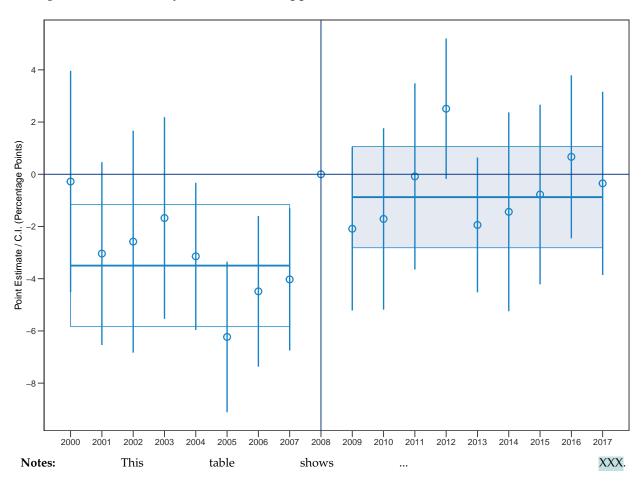


Figure 12: Event Study Plot: Populist Party - Cutoff 90<sup>th</sup> Percentile (without individual FE)

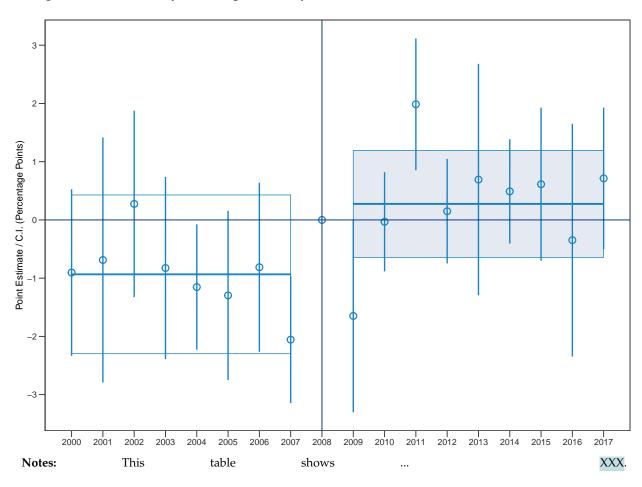
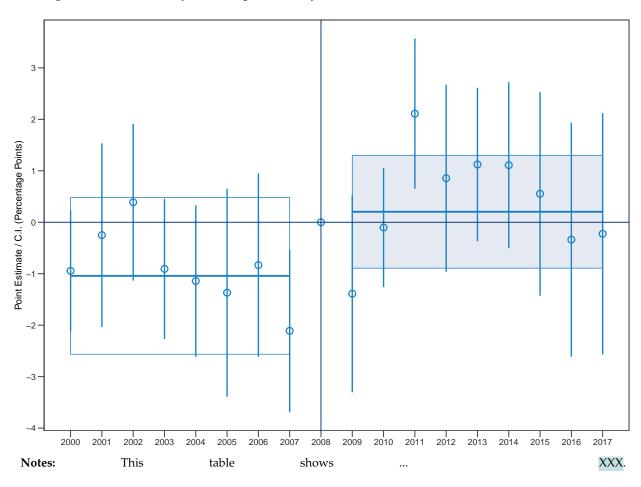
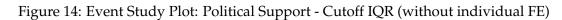
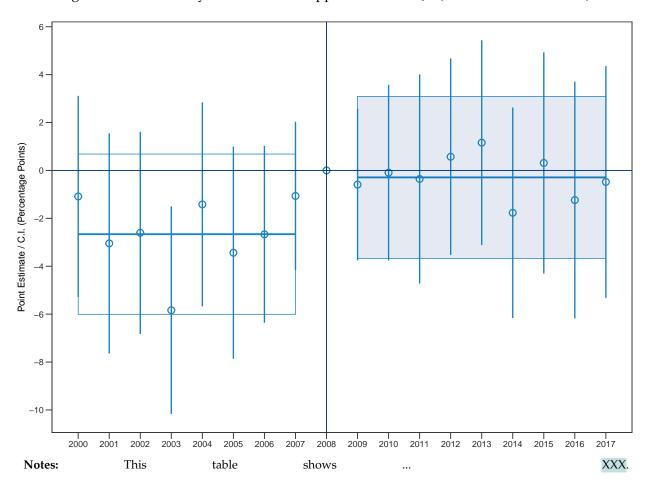
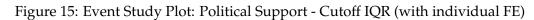


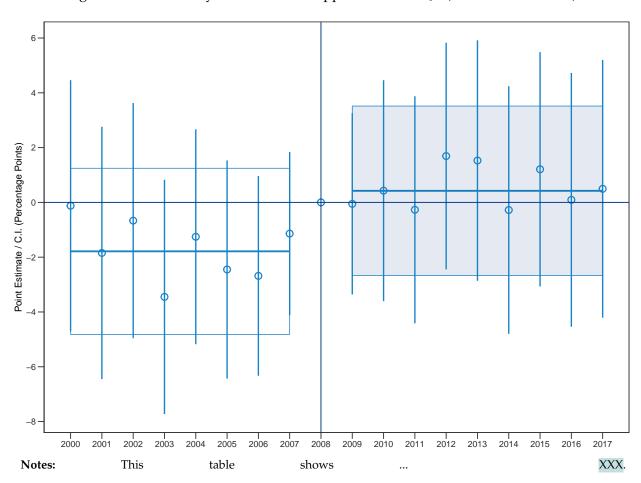
Figure 13: Event Study Plot: Populist Party - Cutoff 90<sup>th</sup> Percentile (with individual FE)



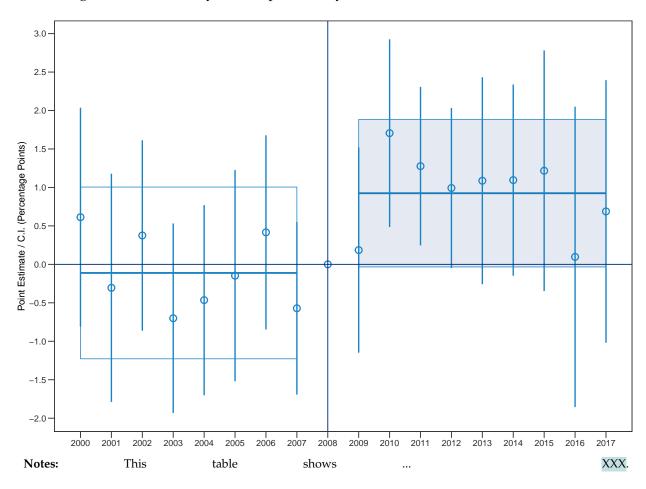














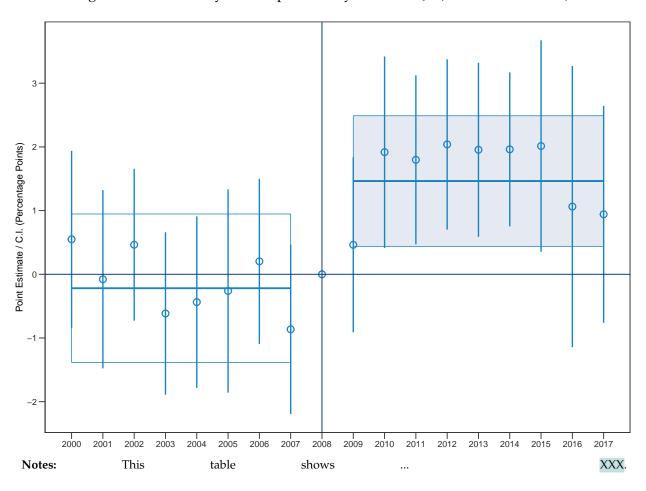


Figure 18: Event Study Plot: Political Support - Cutoff  $10^{th}$ – $90^{th}$  Percentile (without individual FE)

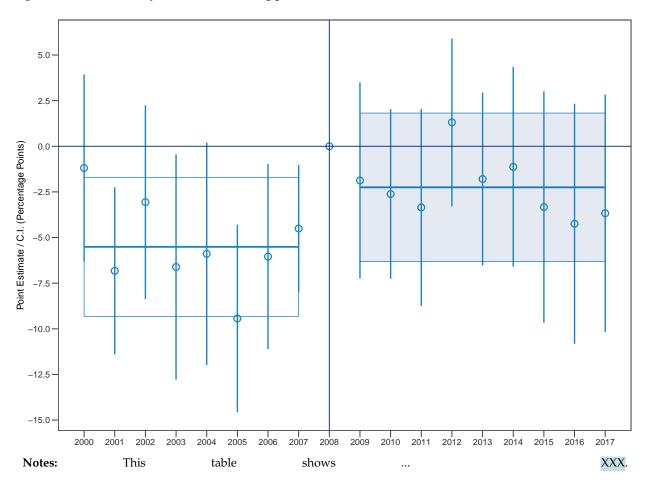


Figure 19: Event Study Plot: Political Support - Cutoff 10<sup>th</sup>–90<sup>th</sup> Percentile (with individual FE)

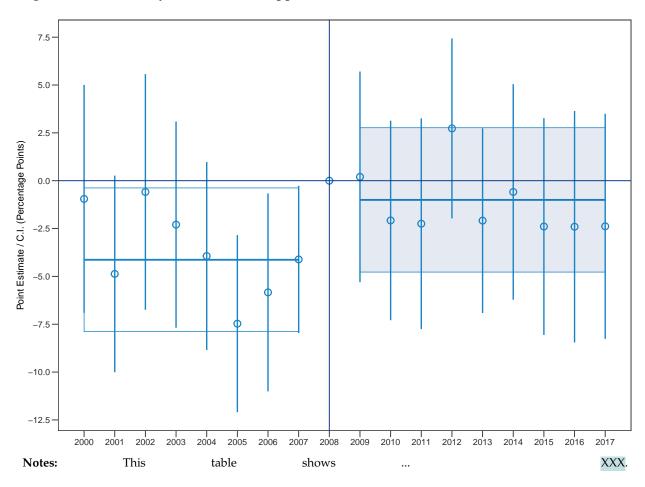


Figure 20: Event Study Plot: Populist Party - Cutoff  $10^{th}$ - $90^{th}$  Percentile (without individual FE)

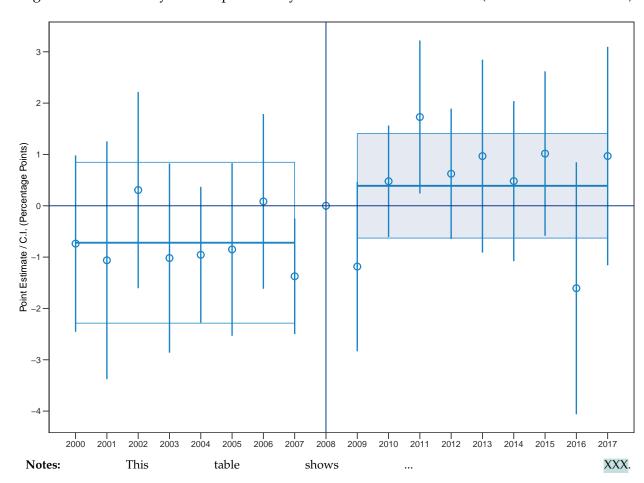


Figure 21: Event Study Plot: Populist Party - Cutoff  $10^{th}$ – $90^{th}$  Percentile (with individual FE)

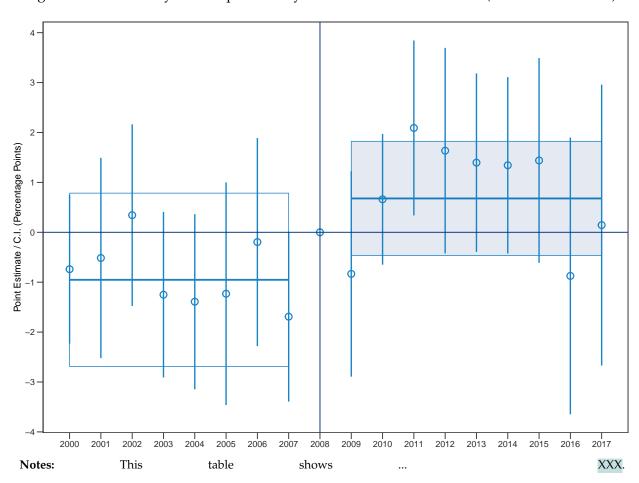


Figure 22: Event Study Plot: Political Support - Continuous Treatment (without individual FE)

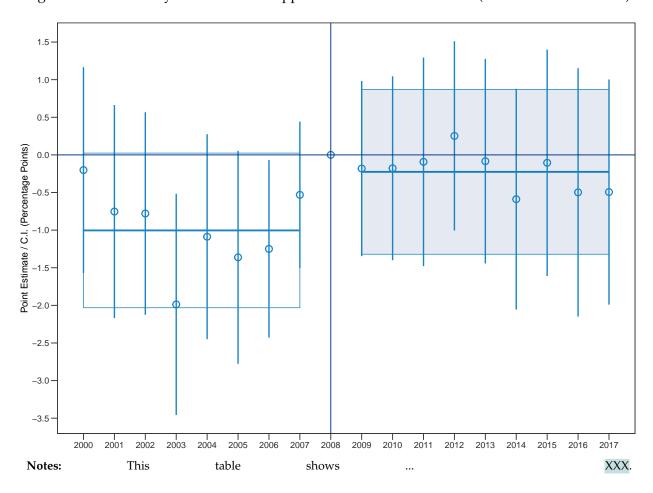


Figure 23: Event Study Plot: Political Support - Continuous Treatment (with individual FE)

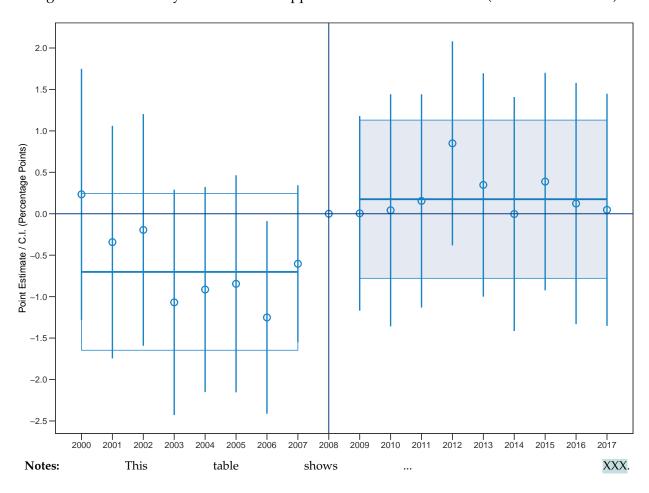


Figure 24: Event Study Plot: Populist Party - Continuous Treatment (without individual FE)

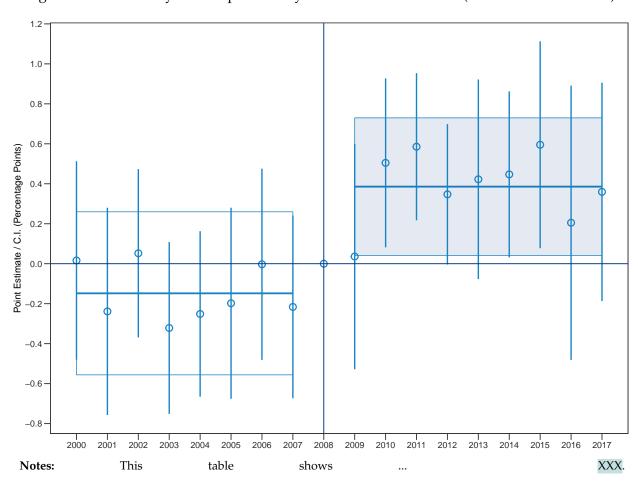


Figure 25: Event Study Plot: Populist Party - Continuous Treatment (with individual FE)

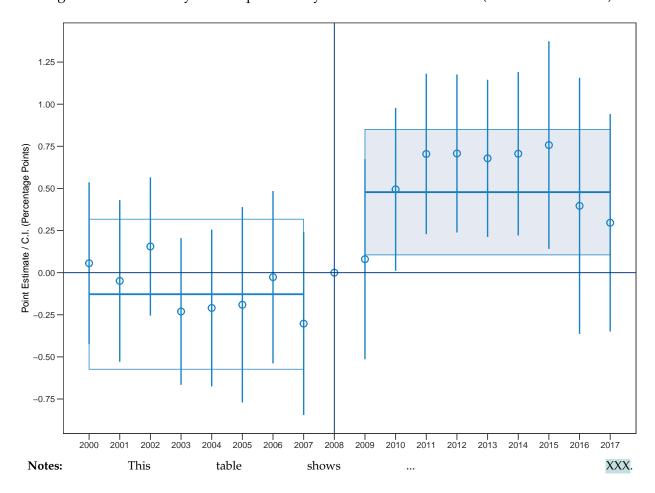


Figure 26: Heterogeneity on Political Support: Continuous Treatment Functional Form (without individual FE) Level-Level

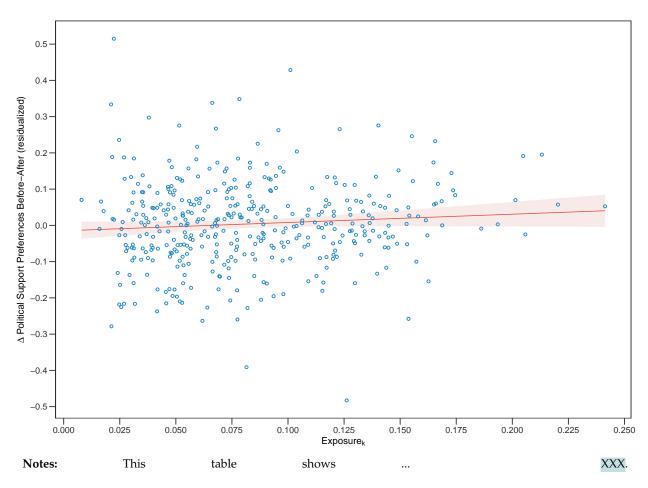


Figure 27: Heterogeneity on Political Support: Continuous Treatment Functional Form (with individual FE) Level-Level

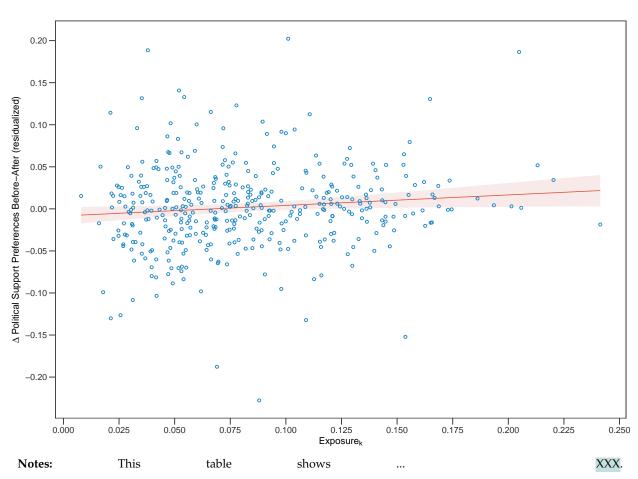


Figure 28: Heterogeneity on Populist Party: Continuous Treatment Functional Form (without individual FE) Level-Level

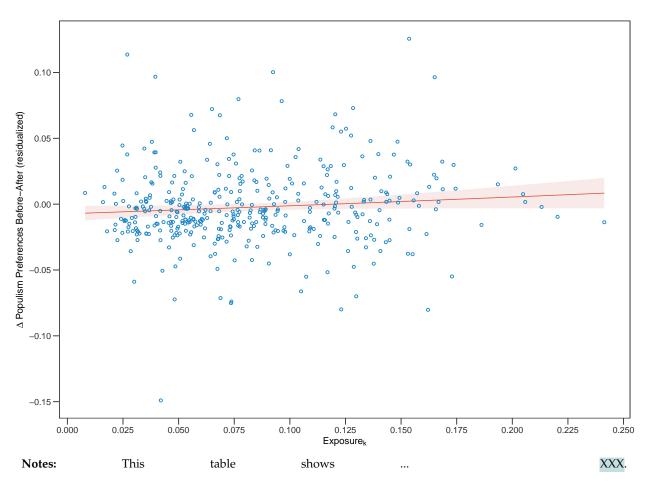


Figure 29: Heterogeneity on Populist Party: Continuous Treatment Functional Form (with individual FE) Level-Level

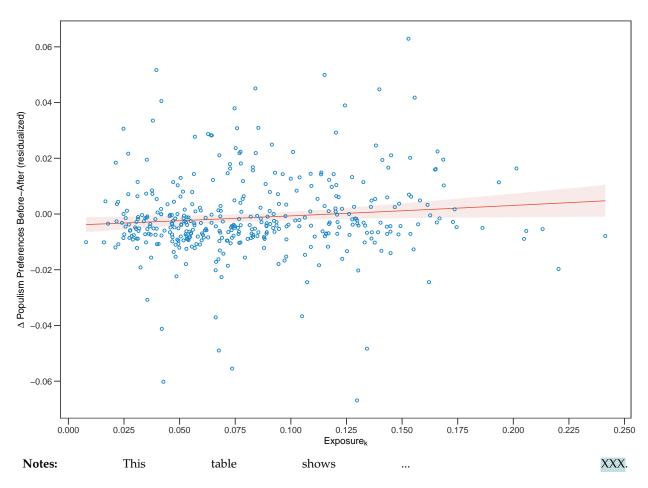


Figure 30: Heterogeneity on Political Support: Continuous Treatment Functional Form (without individual FE) Log-Log

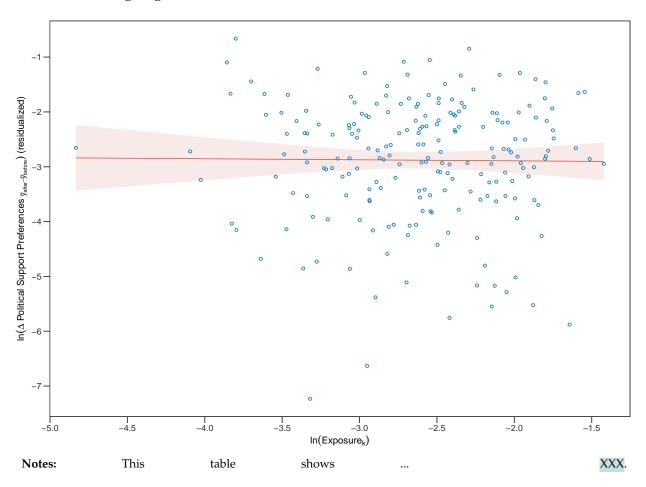


Figure 31: Heterogeneity on Political Support: Continuous Treatment Functional Form (with individual FE) Log-Log

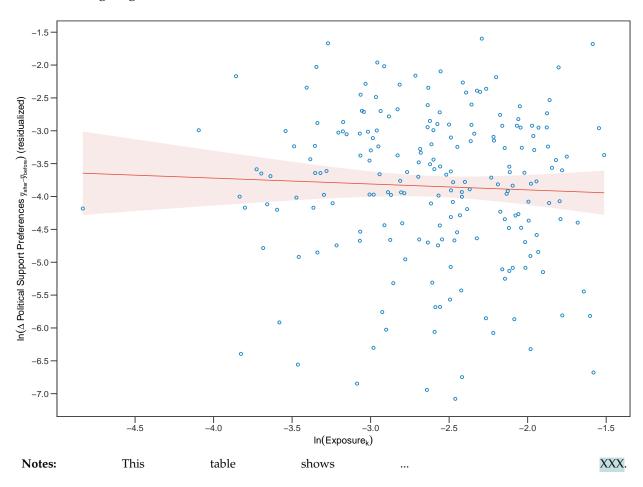


Figure 32: Heterogeneity on Populist Party: Continuous Treatment Functional Form (without individual FE) Log-Log

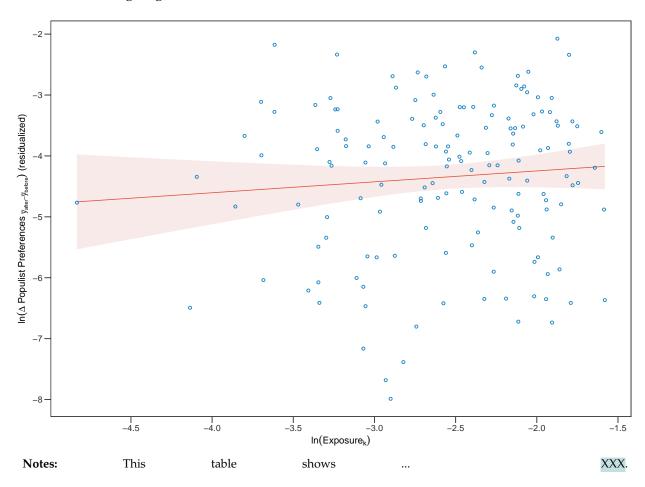
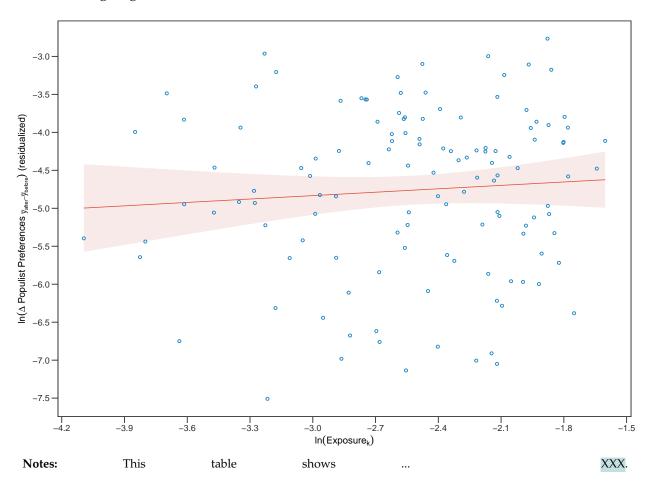


Figure 33: Heterogeneity on Populist Party: Continuous Treatment Functional Form (with individual FE) Log-Log



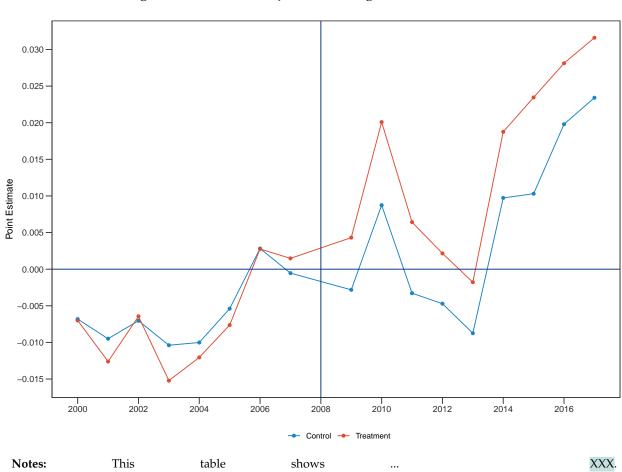


Figure 34: Outcome Trajectories Using Wave Fixed Effects

Figure 35: Outcome Trajectories After Residualizing and running regression with dummy for years by treatment group

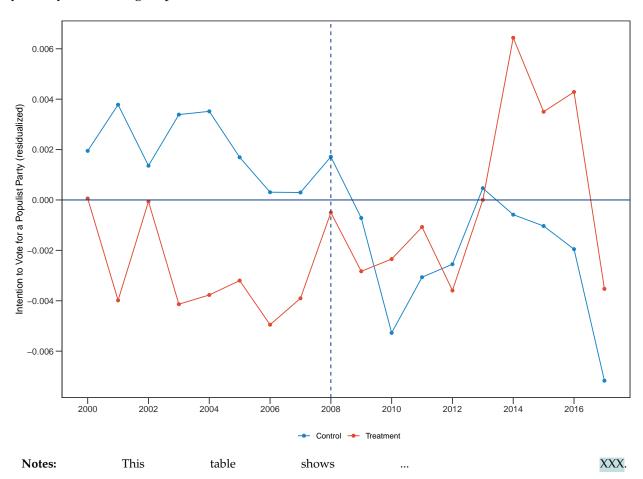


Figure 36: Outcome Trajectories After Residualizing and running regression with dummy for years by treatment group, reference 2008

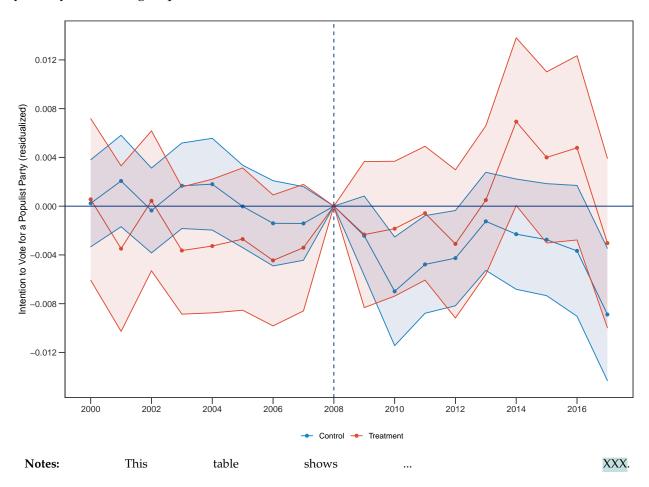


Table 6: The Effect of the Credit Shock on Political Preferences: Outcome as Topic Model Scores

	<b>Banking and Financial Crisis</b>					Popt	ılism		Combined				
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)	
Panel A: Parliamentary De	bates												
$Exposure_k \times Post$	0.054***	-0.027**	0.046***	0.038**	0.131***	0.013	0.107***	0.115***	0.063***	-0.025*	0.054***	0.047***	
	(0.018)	(0.014)	(0.017)	(0.017)	(0.023)	(0.011)	(0.024)	(0.024)	(0.019)	(0.014)	(0.018)	(0.017)	
Number of Observations	135,547	135,547	125,914	125,914	135,547	135,547	125,914	125,914	135,547	135,547	125,914	125,914	
Number of Counties	399	399	398	398	399	399	398	398	399	399	398	398	
Outcome Mean (%)	1178.982	1178.982	1179.061	1178.699	373.28	373.28	372.382	372.334	1167.783	1167.783	1167.782	1167.429	
$sd\left(Exposure_k\right)$ (%)	4.76	4.76	4.757	4.759	4.76	4.76	4.757	4.759	4.76	4.76	4.757	4.759	
Within R <sup>2</sup>	0.010	0.006	0.005	0.006	0.014	0.006	0.008	0.011	0.010	0.006	0.005	0.006	
Panel B: Electoral Manifest	tos												
$Exposure_k \times Post$	-0.038**	0.081***	-0.011	-0.018	0.026	0.147***	0.037**	0.043**	-0.036**	0.091***	-0.009	-0.015	
	(0.016)	(0.028)	(0.018)	(0.020)	(0.016)	(0.032)	(0.019)	(0.019)	(0.016)	(0.029)	(0.019)	(0.021)	
Number of Observations	37,340	37,340	25,577	25,577	37,340	37,340	25,577	25,577	37,340	37,340	25,577	25,577	
Number of Counties	398	398	392	392	398	398	392	392	398	398	392	392	
Outcome Mean (%)	448.159	448.159	447.168	447	155.681	155.681	156.556	156.678	457.711	457.711	456.784	456.625	
$sd(Exposure_k)$ (%)	4.756	4.756	4.751	4.753	4.756	4.756	4.751	4.753	4.756	4.756	4.751	4.753	
Within R <sup>2</sup>	0.049	0.046	0.002	0.004	0.041	0.042	0.002	0.002	0.052	0.049	0.001	0.004	
County-Level FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Wave FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Individual FE	No	No	Yes	Yes	No	No	Yes	Yes	No	No	Yes	Yes	
Individual Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Household Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	
Regional Controls	Yes	No	No	Yes	Yes	No	No	Yes	Yes	No	No	Yes	
County Time Trends	No	Yes	No	No	No	Yes	No	No	No	Yes	No	No	

Table 7: The Effect of the Credit Shock on Political Preferences: Outcome as Dictionary Scores

	Banking and Financial Crisis					Populism				Combined				
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)		
Panel A: Parliamentary De	ebates													
$Exposure_k \times Post$	0.039***	0.018***	0.027***	0.030***	0.130***	0.007	0.104***	0.111***	0.053***	0.019***	0.038***	0.042***		
N. I. (OL e	(0.005)	(0.006)	(0.007)	(0.007)	(0.024)	(0.011)	(0.023)	(0.023)	(0.007)	(0.007)	(0.010)	(0.009)		
Number of Observations Number of Counties	135,547 399	135,547 399	125,914 398	125,914 398	135,547 399	135,547 399	125,914 398	125,914 398	135,547 399	135,547 399	125,914 398	125,914 398		
Outcome Mean (%)	340.635	340.635	341.458	341.01	418.114	418.114	417.262	417.216	380.753	380.753	381.461	381.017		
$sd(Exposure_k)$ (%)	4.76	4.76	4.757	4.759	4.76	4.76	4.757	4.759	4.76	4.76	4.757	4.759		
Within $R^2$	0.037	0.033	0.003	0.004	0.015	0.007	0.008	0.011	0.032	0.027	0.004	0.006		
Panel B: Electoral Manifes	tos													
$Exposure_k \times Post$	0.146***	0.214***	0.171***	0.171***	0.003	0.117***	0.029	0.032	0.145***	0.229***	0.173***	0.174***		
	(0.028)	(0.041)	(0.035)	(0.036)	(0.016)	(0.034)	(0.020)	(0.020)	(0.029)	(0.044)	(0.036)	(0.037)		
Number of Observations	37,340	37,340	25,577	25,577	37,340	37,340	25,577	25,577	37,340	37,340	25,577	25,577		
Number of Counties	398	398	392	392	398	398	392	392	398	398	392	392		
Outcome Mean (%)	269.169	269.169	269.812	269.671	156.516	156.516	157.233	157.347	289.319	289.319	290.059	289.936		
$sd\left(Exposure_k\right)$ (%)	4.756	4.756	4.751	4.753	4.756	4.756	4.751	4.753	4.756	4.756	4.751	4.753		
Within R <sup>2</sup>	0.019	0.014	0.015	0.015	0.052	0.053	0.002	0.002	0.021	0.017	0.014	0.014		
County-Level FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes		
Wave FE	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes		
Individual FE	No	No	Yes	Yes	No	No	Yes	Yes	No	No	Yes	Yes		
Individual Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes		
Household Controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes		
Regional Controls	Yes	No	No	Yes	Yes	No	No	Yes	Yes	No	No	Yes		
County Time Trends	No	Yes	No	No	No	Yes	No	No	No	Yes	No	No		

# References

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