

Macrointerest Across Countries

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Abstract

The extent to which the public takes an interest in politics has long been argued to be foundational to democracy, but the want of appropriate data has prevented cross-national and longitudinal analysis. This letter takes advantage of recent advances in latent-variable modeling of aggregate survey responses and a comprehensive collection of survey data to generate dynamic comparative estimates of macrointerest, that is, aggregate political interest, for over a hundred countries over the past four decades. These macrointerest scores are validated with other aggregate measures of political interest and of other types of political engagement. A cross-national and longitudinal analysis of macrointerest in advanced democracies reveals that along with election campaigns and inclusive institutions, it is good (economic) times, not bad, that spur publics to greater interest in politics.

1 Introduction

The public’s interest in politics has long been argued to be fundamental to democracy, the foundation for the widespread civic engagement needed to hold elected officials accountable to citizen demands (Butler and De La O 2010; Lane, Do, and Molina-Rogers 2022). In light of the growing threats to democracy seen in many countries, measuring the levels and trends of aggregate political interest—macrointerest—and understanding their sources is therefore crucially important (Peterson et al. 2022).

Data to allow for large-scale cross-sectional time-series assessments, however, have been unavailable. Although many surveys ask respondents across countries how interested they are in politics, differences in question wording and in response categories have limited scholars’ ability to pool the data together, and even in the absence of these issues, in most countries the questions have not been asked sufficiently frequently to provide annual time series.

This letter takes advantage of recent advances in latent-variable modeling of aggregate survey responses and a comprehensive collection of survey data to generate dynamic comparative estimates of aggregate political interest for over a hundred countries over the past four decades. It shows that these cross-national macrointerest scores perform well in validation tests. Finally, as a demonstration of their utility, the letter presents a new test of theories on the circumstances that induce the public of advanced democracies to take more interest in politics. The results support arguments that, in these countries, election campaigns, inclusive institutions, and good economic times, not bad ones, spur greater political interest.

2 Cross-National Macrointerest: The Source Data

National and cross-national surveys have asked questions on political interest often over the past four decades, but the resulting data are both sparse, that is, unavailable for many countries and years, and incomparable, generated by many different survey items. In all, 50 such survey items were asked in no fewer than five country-years in countries surveyed at least twice; these items were drawn from 359 different survey datasets (see online Appendix A).

Together, the survey items in the source data were asked in 128 different countries in at least three time points over the 40 years from 1982 to 2022, yielding a total of 2,681 country-year-item observations. Observations for every year in each country surveyed would number 5,120, and a complete set of country-year-items would encompass 256,000 observations. Compared to this hypothetical complete set of country-year-items, the available data are very, very sparse. More optimistically, there are 1,798 country-years in which there is at least *some* information about the public’s interest in politics, that is, some 57% of the 3,151 country-years spanned by these data. Still, the multitude of different survey items makes these data incomparable and difficult to use together.

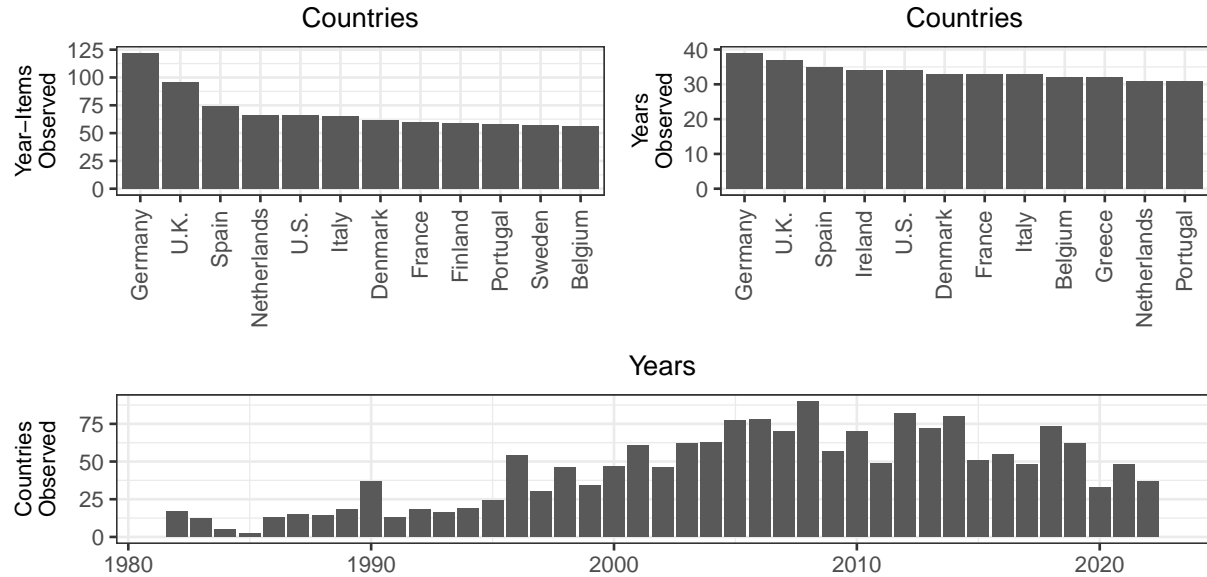


Figure 1: Countries and Years with the Most Observations in the Source Data

In the top left panel of Figure @ref(fig:item_country_plots), the twelve countries with the most country-year-item observations is displayed. Germany, with 122 observations, is the best represented country in these source data, followed by the United Kingdom, Spain, the Netherlands, and the United States. At the other end of the scale, there are seven countries—Azerbaijan, Cambodia, Kosovo, Kyrgyzstan, Liberia, Myanmar (Burma), and Puerto Rico—that have only the bare minimum three observations needed to be included in the source dataset at all. In the top right panel are the dozen countries with the most

observed years; this group is similar to that on the left, but with Ireland and Greece adding to the list and Finland and Sweden dropping off. The bottom panel shows the number of countries observed in each year. Coverage across countries reached its apex in 2008, when respondents in 90 countries were asked at least one item about their interest in politics. The next section describes how this sparse and incomparable survey data was used together with a latent variable model to generate complete time series of macrointerest scores that are comparable across countries.

3 Estimating Cross-National Macrointerest

Several recent studies have developed latent variable models of aggregate survey responses based on cross-national survey data (see Claassen 2019; Caughey, O’Grady, and Warshaw 2019; McGann, Dellepiane-Avellaneda, and Bartle 2019; Kolczynska et al. 2020). To estimate the public’s interest in politics across countries and over time, this work employs the latest of these methods that is appropriate for data that are both incomparable and sparse, the Dynamic Comparative Public Opinion (DCPO) model elaborated in Solt (2020b).¹ The DCPO model is a population-level two-parameter ordinal logistic item response theory model with country-specific item-bias terms.² For a comprehensive description of the DCPO model, see Appendix C and Solt (2020b, 3–8); the focus here is on how it deals with the two principal issues raised by the source data, incomparability and sparsity.

¹Solt (2020b) demonstrates that the DCPO model provides a better fit to survey data than the models put forward by Claassen (2019) or Caughey, O’Grady, and Warshaw (2019). The McGann, Dellepiane-Avellaneda, and Bartle (2019) model depends on dense survey data unlike the sparse data on interest in politics described in the preceding section. Kolczynska et al. (2020) is the very most recent of these five works and builds on each of the others, but the MRP approach developed in that piece is suitable not only when the available survey data are dense but also when ancillary data on population characteristics are available, so it is similarly inappropriate to this application. It is perhaps worth noting that the dyad-ratios model employed in Peterson et al. (2022) generates time series of public opinion in only a *single* country that is not easy nor efficient to be expanded to cross-national analyses (see Caughey, O’Grady, and Warshaw 2019, 686). We also conducted a more detailed comparison between DCPO and Peterson et al. (2022)’s Wcalc in Appendix E.

²Several alternative approaches exist for transforming data to the unit interval, e.g., the cumulative distribution function (CDF) of the normal distribution, which facilitates the interpretation of results as percentiles. Each transformation method carries distinct assumptions and conditions. It is imperative for researchers to select a method that aligns optimally with their data characteristics and research objectives.

The DCPO model accounts for incomparability using three sets of parameters. First, it incorporates the *difficulty* of each question’s responses, that is, how much interest in politics is indicated by a given response. This is most evident with respect to response categories: to say that one is “very interested” in politics, for example, is to exhibit more interest than to say that one is “somewhat interested” or “not very interested.” Here, difficulty is permitted to vary with question wording and the survey project as well. Second, the DCPO model accounts for each question’s *dispersion*, its noisiness with regard to our latent trait. The lower the dispersion, the better that changes in responses to the question map onto changes in macrointerest. Third, to provide for the possibility that translation issues or cultural differences result in the same question being interpreted differently in different countries, the model estimates *country-specific bias* parameters that shift the difficulty of all responses for a particular question in a particular country. Together, the model’s difficulty, dispersion, and country-specific bias parameters work to generate comparable estimates of the latent variable of macrointerest from the available but incomparable source data.³

To address the sparsity of the source data—the fact that there are gaps in the time series of each country, and that even many observed country-years have only one or two observed items—DCPO uses simple local-level dynamic linear models, i.e., random-walk priors, for each country. That is, within each country, each year’s value of macrointerest is modeled as the previous year’s estimate plus a random shock. These dynamic models smooth the estimates of macrointerest over time and allow estimation even in years for which little or no survey data is available, albeit at the expense of greater measurement uncertainty.

The model was estimated using the `DCPOtools` package for R (Solt, Hu, and Tai 2019), running four chains for 1,000 iterations each and discarding the first half as warmup, leaving 2,000 samples. The \hat{R} diagnostic had a maximum value of 1.01, indicating that the model converged. The dispersion parameters of the survey items indicate that all of them load well on the latent variable (see Appendix A). The result is estimates, in all 3,151 country-years spanned by the source data, of the mean political interest of the public, that is, macrointerest.

³See a discussion of how other data issues, such as sample representation, may affect the estimated outcome in Appendix C.

4 Validating Cross-National Macrointerest

That estimates can be generated for macrointerest or any other latent variable, however, does not automatically mean that they are suitable for analysis. As is the case for any new measure, validation tests of cross-national latent variables are crucially important (see, e.g., Hu et al. 2023). Figure 2 and Figure 3 provide evidence of this measure’s validity with tests of convergent validation and construct validation. Convergent validation refers to tests of whether a measure is empirically associated with alternative indicators of the same concept (Adcock and Collier 2001, 540). In Figure 2, the macrointerest scores are compared to responses to individual source-data survey items that were used to generate them; this provides an ‘internal’ convergent validation test (see, e.g., Caughey, O’Grady, and Warshaw 2019, 686 in which the correlations between the estimated variable and other indicators vary from 0.65 to 0.96. Be aware that correlations can be also affect by data richness, survey context, and other factors.).

In the left panel, macrointerest scores are plotted against the percentage of respondents across all country-years who offered the two most interested responses on the European Social Survey’s four-point item, “How interested are you in politics?” The middle panel shows responses to the question with the most data-rich cross-section, “How interested would you say you personally are in politics?” in the International Social Survey Program’s 2004 module on Citizenship. Finally, the right panel evaluates how well the macrointerest scores capture change over time by focusing on the item with the largest number of observations for a single country in the source data, which asked respondents to Germany’s ALLBUS, “How interested in politics are you?” In all three cases, the correlations, estimated taking into account the uncertainty in the measures, are noticeable.

Construct validation, on the other hand, refers to demonstrating, for some *other* concept believed causally related to the concept a measure seeks to represent, that the measure is empirically associated with measures of that other concept (Adcock and Collier 2001, 542). Figure 3 depicts the relationships between macrointerest and three survey items from the World Values Survey and European Values Survey on other aspects of political engage-

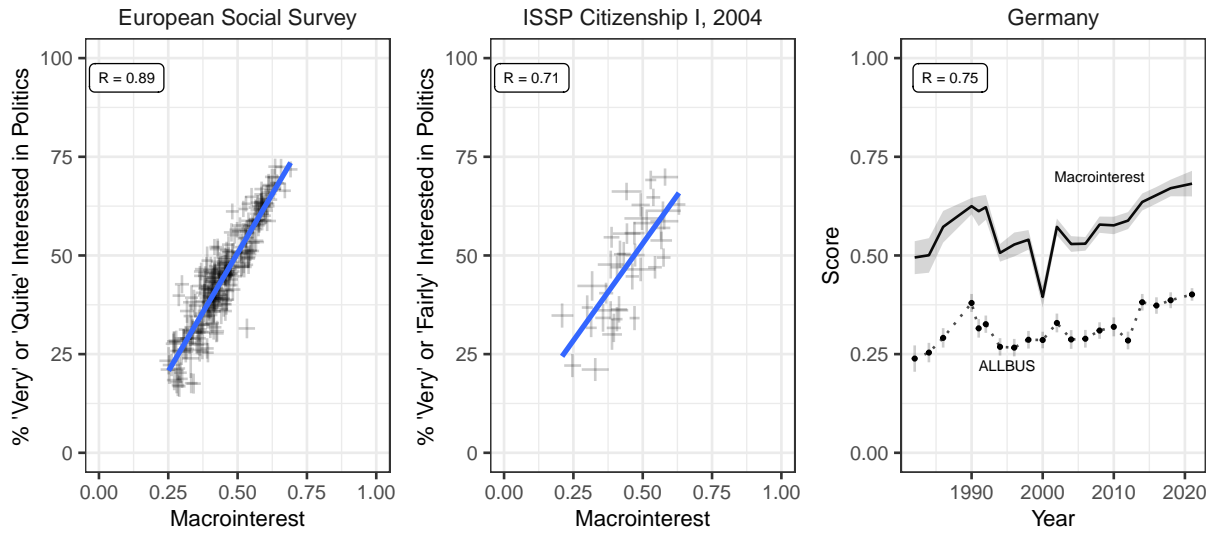


Figure 2: Internal Convergent Validation: Correlations Between Macroiinterest and Individual Source-Data Survey Items

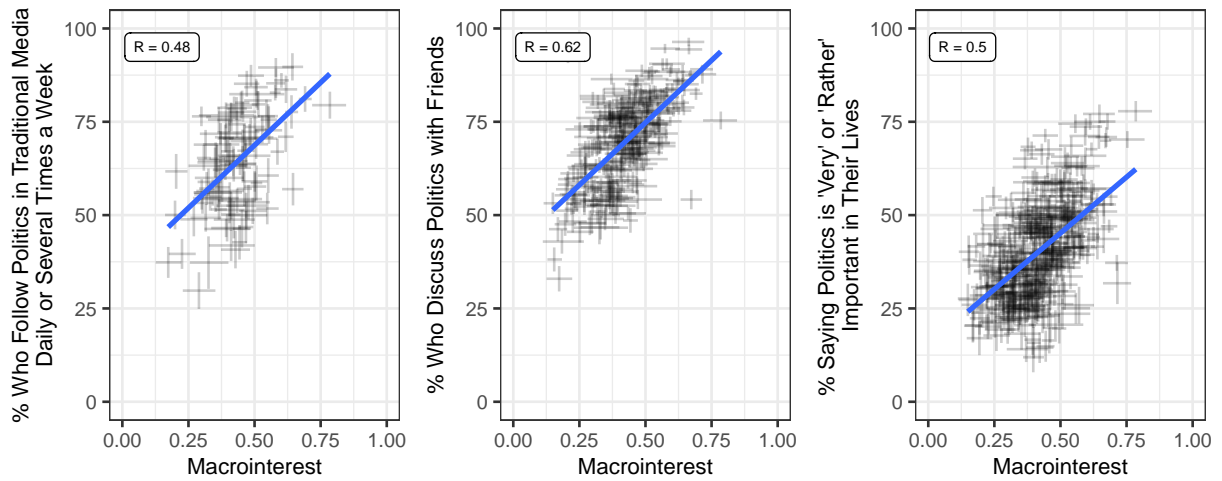


Figure 3: Construct Validation: Correlations Between Macroiinterest and Other Aspects of Political Engagement

ment that are expected to have causal relationships with political interest (see Kittilson and Schwindt-Bayer 2010, 995): in the left panel, following political news on television, radio, and newspapers; in the center panel, discussing politics with friends; and on the right, feeling politics is important to one's life. These relationships are all positive and are moderate to strong. This cross-national latent variable of macrointerest performs impressively well in validation tests.

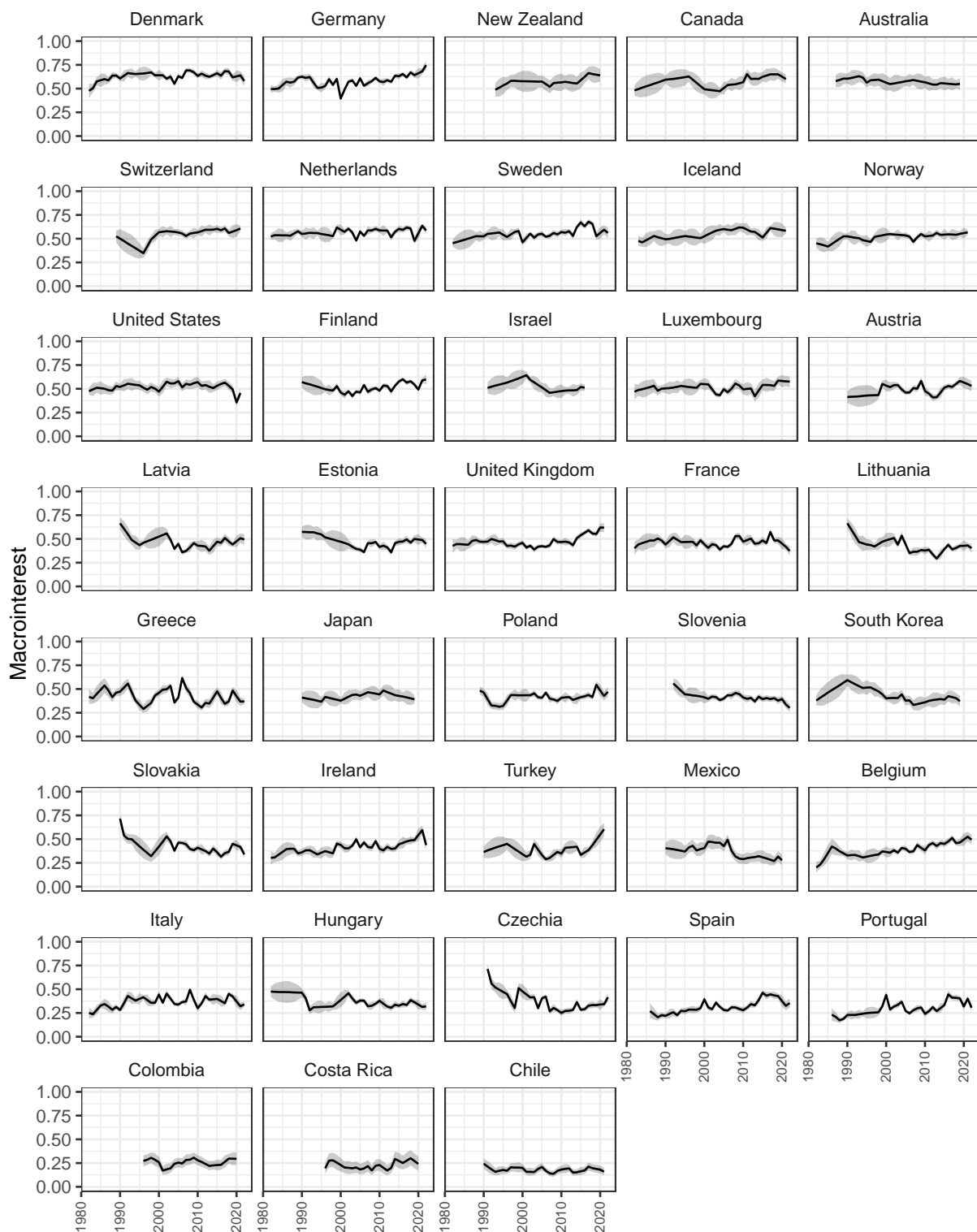
5 Testing Theories of Macrointerest Cross-Nationally

Macrointerest varies greatly around the world. Figure 4 examines levels and trends in macrointerest in advanced democratic countries by displaying the changes of the public's expressed interest in politics over time in the thirty-seven democracies of the OECD.⁴ While macrointerest scores approach and often exceed .6 in countries such as Denmark and Canada, in Chile they scarcely cross .25. And although the public's political interest has held fairly steady over decades in many countries, in Czechia it dropped nearly half of the variable's entire theoretical range over the 1990s and 2000s before rebounding slightly since 2010, and increases of roughly a quarter of that range can be seen in, among others, Germany. There are considerable differences in the extent to which the public professes interest in politics both across countries and over time.

What explains these differences? One straightforward explanation is that publics grow more interested in politics at election time. Campaigns and elections attract media coverage and increase the information available to the public on the issues being contested, leading to increased interest in politics (see, e.g., Beach, Hansen, and Larsen 2018; Larsen 2022). Macrointerest within each country should be expected to be higher, therefore, in years in which national elections take place than in years without elections.

A second argument is that political institutions that share power, rather than concentrate it, yield politics that are more interesting and engaging. Building on Lijphart (1999) and Powell (2000), Kittilson and Schwindt-Bayer (2010, 992) argues that power-sharing

⁴Appendix B presents these data for all available countries.



Note: Countries are ordered by their median macrointerest score; gray shading represents 80% credible intervals.

Figure 4: Macrointerest Scores Over Time Within OECD Democracies

institutions—parliamentarism, federalism, and proportional electoral rules—“send signals of inclusiveness to citizens, generating greater political engagement” while power-concentrating institutions “may generate perceptions of exclusion and deter involvement.” Macrointerest should be higher in countries with parliamentary and federal systems than in those without those features, and it should decline as the disproportionality between votes cast and seats won increases.

A third claim deals with the public’s demand for accountability. Peterson et al. (2022, 203) advances this argument: “when there is information that something has gone wrong ...then voters should be more likely to attend to the actions of elected officials,” but when “there is evidence of success ...voters should not waste their energies focusing on the activities of their representatives.” If democracy is a principal-agent problem with elected officials acting as self-interested agents and the public as their lazy but vengeful principal, then macrointerest should rise when times are bad and decline as conditions improve.

A final set of theories—each well established—contradicts the third. Modernization theory holds that the public’s interest in politics will increase as the national economy grows and household incomes expand (see, e.g., Inglehart and Welzel 2005). Unemployment has long been argued to not to motivate but rather to depress political interest; Rosenstone (1982, 26), for example, argued that “it causes a preoccupation with personal economic well-being, and as a result, the citizen withdraws from such external matters as politics.” And the relative power theory holds that greater income inequality, by increasingly concentrating political power in the hands of the wealthy, allows them greater power to shape the political agenda in ways that discourage the broader public from taking interest (see, e.g., Solt 2008). In each of these circumstances, macrointerest is argued to grow along with increasing economic growth (“good” times), not worsening economic growth (“bad” times) (see also Stimson 2015; Peterson et al. 2022, 206).

Data to test these hypotheses regarding the causes of macrointerest are drawn from several sources. The Democratic Electoral Systems (DES) dataset updated in Bormann and Golder (2022) provides information about the timing of elections, yielding a dichoto-

mous variable coded one in election years and zero when no election was held. The three institutional variables are measured as in Kittilson and Schwindt-Bayer (2010). Data on parliamentarism, a dichotomous variable coded one in pure parliamentary systems and zero otherwise, is also sourced from the DES. Federalism is a third dichotomous variable, coded one in countries with strong federal systems (see Lijphart 1999) and zero in all others. The proportionality of the electoral system is measured using the Gallagher least-squares index of disproportionality, which measures the disparity between parties’ vote shares and their seat shares (Gallagher 1991, 40–41). The context of good times and bad was measured with data on GDP per capita, national GDP growth, and unemployment from OECD.Stat (OECD 2023) and on the Gini index of disposable income inequality from the Standardized World Income Inequality Database (Solt 2020a).

The resulting dataset comprises the thirty-seven OECD democracies, each observed in twenty-one (Mexico) to forty (Ireland, Italy, the United Kingdom, and the United States) consecutive years (mean: 32.4 years, median: 31 years). Shor et al. (2007) demonstrates that such pooled time series are best analyzed using a Bayesian multilevel model including varying intercepts for each country and each year. The former help account for heteroskedasticity across space due to, e.g., omitted variable bias, while permitting the inclusion of time-invariant predictors such as, in this dataset, parliamentarism and federalism. The latter take into account ‘time shocks’ that operate on all countries simultaneously (Shor et al. 2007, 171–72). Further, the ‘within-between random effects’ specification is employed, meaning each of the time-varying predictors is decomposed into its time-invariant country mean and the difference between each country-year value and this country mean; this specification has been shown superior to fixed effects and other commonly used TSCS specifications for addressing omitted variable bias and endogeneity (see Bell and Jones 2015). The time-varying difference variables capture the short-term effects of the predictors, while the time-invariant country-mean variables reflect their—often different—long-run, “historical” effects (Bell and Jones 2015, 137). The measurement uncertainty in the data for both macrointerest and income inequality was incorporated into the analysis with the “method of composition,” a technique

frequently utilized across numerous studies in political science (e.g., Caughey and Warshaw 2018; Kastellec et al. 2015; Tai, Hu, and Solt 2022). (See Supplementary Material C of Tai, Hu, and Solt (2022) for a comprehensive review and application instruments in the DCPO framework.) The model was estimated using the `brms` R package (Bürkner 2017).

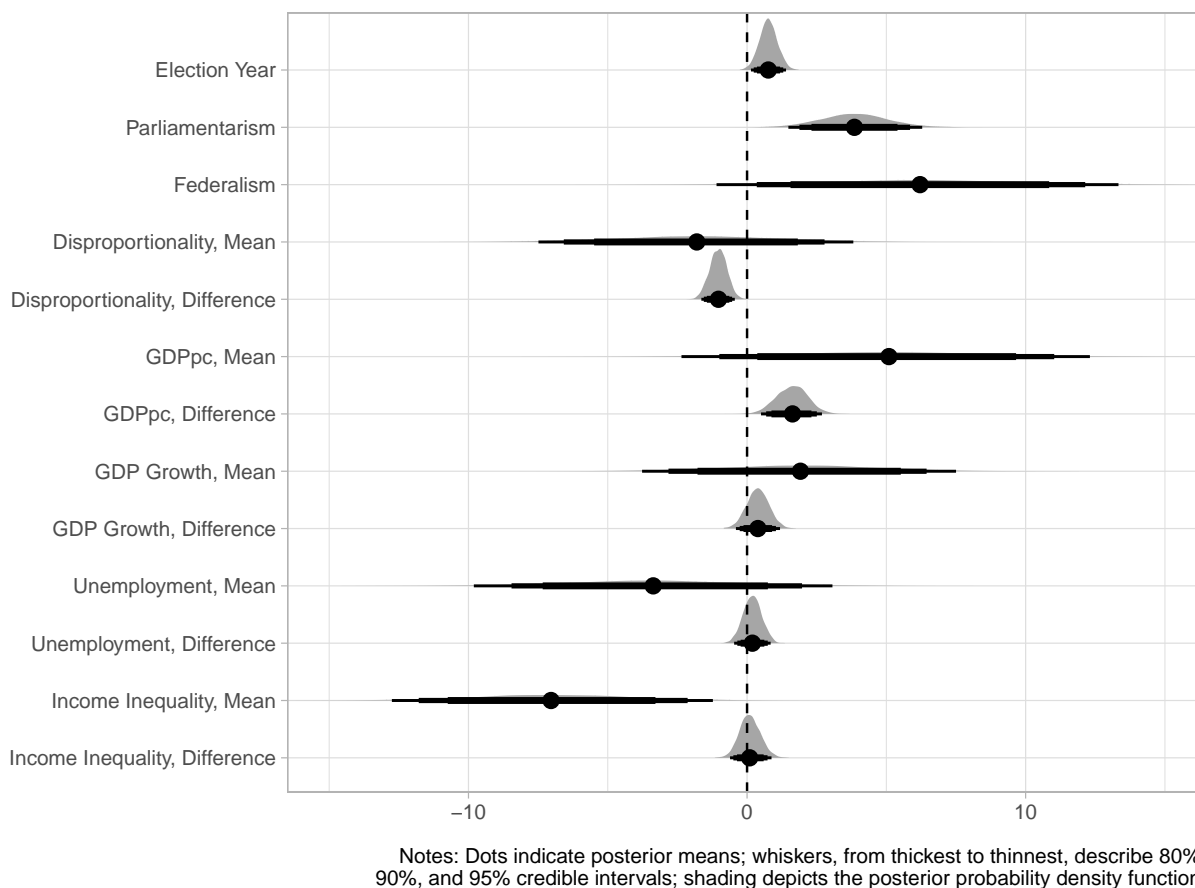


Figure 5: Predicting Macroiinterest in OECD Democracies

Figure 5 displays the results. Consistent with the argument that campaigns bring attention-grabbing information to the public, the posterior distribution shows a 95% probability that macrointerest in election years is 0.1 to 1.4 higher than in years without elections. This is in line with previous research finding small but well-estimated increases in political interest in election years (see, e.g., Larsen 2022).

The hypothesis that power-sharing institutions yield more public interest in politics is also supported. It is a 95% confident that macrointerest is 1.5 to 6.3 points higher in coun-

tries with parliamentary systems, according to the posterior probabilities. The difference between countries with and without federalism is estimated to be even larger on average (6.2, cp. 3.9 for parliamentarism), though only 90% confidence is bounded away from zero. And although disproportionality is not estimated to have long-run effects that consistently distinguish countries with more or less proportional electoral results, *changes* in disproportionality appear to have an immediate negative effect: a two-standard-deviation increase in the Gallagher index has 95% confidence reducing -1.6 to -0.4 points of macrointerest.

On the debate on whether macrointerest is invigorated or instead discouraged by bad times, the evidence from this cross-national analysis falls heavily on the side of the latter. Supporting modernization theory, increases in per capita GDP have a well estimated positive short-term effect on aggregate political interest, with a two-standard-deviation increase associated with 0.5 to 2.7 points more macrointerest (with 95% credibility). The long-term, historical effect as evidenced by differences in mean levels across countries is found to be larger, 0.4 to 9.7 points but only with 80% confidence. The effect for growth in the national economy are positive as well, but there is not enough credibility to distinguish it from zero according to the posterior probabilities. The findings with regard to unemployment are similar. Supporting the relative power theory, the posterior distribution indicates 95% credibility that the long-term effects of income inequality may cause -12.7 to -1.2 points macrointerest reduction with every two-standard-deviation difference across countries on average. Year-to-year changes in income inequality are found to make little difference—the influence of the wealthy over the political agenda, it would seem, does not change on such a short time scale, from one perspective, and there is no evidence that the public reacts to worsening conditions in the distribution of income with greater interest in its agents' actions, from the other. Taken as a whole, evidence moderately supports the notion that absolute economic growth, rather than depression, is associated with increased macrointerest, while the distributional bias in economic growth outcomes consistently diminishes macrointerest.

6 Conclusions

Macrointerest, despite its theoretical importance, has as yet drawn only limited empirical attention. This oversight largely reflects the paucity of available data to measure this important concept. The cross-national macrointerest dataset presented here addresses this issue, providing annual time series across more than a hundred countries and allowing more and better tests of the wide range of theories that implicate the public’s interest in politics. For example, while the cross-sectional analysis in Kittilson and Schwindt-Bayer (2010, 997–99) found that, among the three inclusive institutions it considered, only the disproportionality of electoral results influenced political interest and engagement, the pooled time-series analysis presented here indicates parliamentarism, federalism, and proportionality all yield greater macrointerest as Kittilson and Schwindt-Bayer (2010) theorized. And although the single-country study in Peterson et al. (2022, 219) concludes that bad times prompt increased macrointerest, this evidence shows just the opposite, that it is *good* times that lead the public to take interest in politics. By drawing on information about *both* differences across countries *and* change over time, it appears these data on cross-national macrointerest provide a firmer basis for drawing sound conclusions. Beyond investigating the sources of macrointerest, the novel cross-national measurement also provide opportunity for further examining its relationship with various types of political participation and civil engagements (Anderson 2007; Verba et al. 1995).

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Appendices

A Survey Items Used to Estimate Macrointerest

National and cross-national surveys have often included questions tapping interest in politics over the past four decades, but the resulting data are both sparse, that is, unavailable for many countries and years, and incomparable, generated by many different survey items. In all, we identified 50 such survey items that were asked in no fewer than five country-years in countries surveyed at least twice; these items were drawn from 359 different survey datasets. These items are listed in the table below, along with the dispersion (α) and difficulty (β) scores estimated for each from the DCPO model. Lower values of dispersion indicate questions that better identify publics with a higher level of trust from those with lower. Items have one less difficulty score than the number of response categories.

Survey dataset codes correspond to those used in the `DCPOtools` R package (Solt, Hu, and Tai 2019); they appear in decreasing order of country-years contributed. In accordance with the advice offered by Hu, Tai, and Solt (2022) to avoid data-entry errors by automating data collection, the `DCPOtools` R package (Solt, Hu, and Tai 2019) was used to compile the responses to these questions. The current version of the software facilitates the entire practical data generation process, from accessing original survey datasets to their conversion into R-compatible formats, and to restructuring them for analysis with the DCPO model. The primary objective is to limit manual interventions, thereby reducing error potential inherent in human-operated data preparation tasks.

Together, the survey items in the source data were asked in 128 different countries in at least two time points over 40 years, from 1982 to 2022, yielding a total of 2,681 country-year-item observations. The number of items observed in the source data for each country-year is plotted in Figure A1 below. The macrointerest scores of country-years with more observed items are likely to be estimated more precisely. The estimates for country-years with fewer (or no) observed items rely more heavily (or entirely) on the random-walk prior and are therefore less certain.

Table A1: Source Survey Information

| Survey | Range | Version | Primary Creator/Maintainer |
|---|-----------|----------------------------|---|
| Afrobarometer | 1999-2015 | r1, r2, r3, r4, r5, r6 | Afrobarometer |
| American National Election Studies | 1960-2020 | v3 | Angus Campbell, Philip Converse, Warren Miller, Donald Stokes; Survey Research Center; Warren Miller, Arthur Miller, Richard Brody, Jack Dennis, David Kovenock, Merrill Shanks; Warren E. Miller, Arthur H. Miller, F. Gerald Kline; Warren E. Miller, Arthur H. Miller; Warren E. Miller; Warren E. Miller, Donald R. Kinder, Steven J. Rosenstone; Warren E. Miller, Donald R. Kinder, Steven J. Rosenstone; Steven J. Rosenstone, Warren E. Miller, Donald R. Kinder, and the National Election Studies; Center for Political Studies; Arthur Lupia, Jon A. Krosnick, Pat Luevano, Matthew DeBell, and Darrell Donakowski |
| American Trends Panel Datasets | 2018-2019 | | Pew Research Center |
| Arab Barometer | 2006-2022 | w1, w2, w3, w4, w5, w6 | Middle East Partnership Initiative, Princeton University, University of Michigan; International Development Research Centre, United States Institute for Peace, University of Michigan, Princeton University; United States Agency for International Development, International Development Research Centre, Qatar National Research Fund, Princeton University, University of Michigan; Middle East Partnership Initiative, BBC Arabic, Qatar National Research Foundation, University, University of Michigan, Harvard University; Middle East Partnership Initiative, Princeton University, University of Michigan, United States Agency for International Development (USAID) |
| Asia/Europe Survey | 2000 | | Takashi Inoguchi |
| Asian Barometer | 2001-2019 | w1, w2, w3, w4, w5 | Hu Fu Center for East Asia Democratic Studies |
| Australian Election Study | 1987-2019 | v1, v2, v3 | McAllister, Ian; Mughan, Anthony; McAllister, Ian; Jones, Roger; Papadakis, Elim; Gow, David; Jones, Roger; McAllister, Ian; Denemark, David; Gow, David; Jones, Roger; McAllister, Ian; Gow, David; Bean, Clive; Gow, David; McAllister, Ian; Bean, Clive; McAllister, Ian; Gibson, Rachel; Gow, David; Bean, Clive; McAllister, Ian; Gow, David; McAllister, Ian; Bean, Clive; Gibson, Rachel Kay; Pietsch, Juliet; Bean, Clive; McAllister, Ian; Pietsch, Juliet; Gibson, Rachel Kay; McAllister, Ian; Makkai, Toni; Bean, Clive; Gibson, Rachel Kay; McAllister, Ian; Bean, Clive; Gibson, Rachel; Makkai, Toni; Sheppard, Jill; Cameron, Sarah |
| Austrian National Election Study | 2017 | v1.0 | Kritzing, Sylvia; Plescia, Carolina; De Sio, Lorenzo; Paparo, Aldo |
| British Election Study | 1997-2019 | | Heath, A. et al.; Clarke, H. et al.; Whiteley, P.F. and Sanders, D.; Fieldhouse, E., Green, J., Evans, G., Schmitt, H., van der Eijk, C., Mellon, J., Prosser, C.; Fieldhouse, E., Green, J., Evans, G., Prosser, C., de Geus, R., Bailey, J., Schmitt, H., van der Eijk, C., Mellon, J. |
| British Social Attitudes | 1986-2020 | e2, e1, e3 | Social and Community Planning Research; National Centre for Social Research |
| CEP Poll: National Survey of Public Opinion | 1991 | | Adimark |
| Canadian Election Study | 2004-2021 | | David A. Northrup; Andre Blais; Elisabeth Gidengil, Neil Nevitte, Joanna Everitt), Patrick Fournier; Patrick Fournier; Fred Cutler; Stuart Soroka; Deitland Stolle; Stephenson, Laura B; Harell, Allison; Rubenson, Daniel; Loewen, Peter John; Stephenson, Laura B.; Harrell, Allison; Rubenson, Daniel; Loewen, Peter John |
| Canadian National Elections Study (CNES) Series | 1997 | v3 | Andre Blais; Elisabeth Gidengil, Richard Nadeau, Neil Nevitte |
| Candidate Countries Eurobarometer | 2002-2003 | v1.0.0, v1.0.1 | the European Commission |
| Citizenship, Involvement, Democracy | 1999-2002 | 1.0.0, 1.0.1, 1.0.2, 1.0.3 | Andersen, Jorgen Goul |

Table A1: Source Survey Information (*continued*)

| Survey | Range | Version | Primary Creator/Maintainer |
|---|-----------|---|--|
| Collaborative Interpersonal Strategy Building w1th Audio Reflection | 1990-2019 | | McKay M Sohlberg |
| Comparative National Elections Project | 1993-2021 | w2, w3, w4 | Dick Gunther |
| Cooperative Congressional Election Study | 2009-2021 | v1, v9, v5, v2, v4, v6 | Stephen Ansolabehere; Ansolabehere, Stephen; Schaffner, Brian; Schaffner, Brian; Ansolabehere, Stephen; Ansolabehere, Stephen; Schaffner, Brian F.; Schaffner, Brian; Stephen Ansolabhere; Brian Schaffner; Stephen Ansolabehere; Sam Luks; Ansolabehere, Stephen; Schaffner, Brian; Luks, Samantha; Schaffner, Brian; Ansolabehere, Stephen; Luks, Sam; Stephen Ansolabehere; Brian Schaffner |
| Cumulated German General Social Survey 1980-2018 | 1980-2018 | v1.1.0 | Allerbeck, Klaus; Allmendinger, Jutta; Andress, Hans-Jurgen |
| Danish National Election Study | 1984-2011 | v1.0.0 | Erik Damgaard, Hans Jorgen Nielsen, Ingemar Glans, Johannes Andersen, Jorgen Elklit, Jorgen Goul Andersen, Karen Siune, Kasper Moller Hansen, Lise Togeby, Ole Borre, Ole Tonsgaard, Palle Svensson, Rune Stubager, Steen Sauerberg, Soren Risbjerg Thomsen, Torben Worre |
| Dutch Parliamentary Election Study Cumulative Dataset, 1971-2006 | 1971-2006 | v1 | Kees Aarts, Bojan Todosijevic, Harry van der Kaap, Dutch Electoral Research Foundation |
| EVA Survey on Finnish Values and Attitudes | 1996-2020 | fsd1085, fsd1086, fsd1087, fsd1262, fsd2078, fsd2292, fsd2430, fsd2628, fsd2933, fsd3001, fsd3093, fsd3157, fsd3305, fsd3330, fsd3494 | Centre for Finnish Business and Policy Studies (EVA) |
| East Asia Social Survey (EASS) | 2012 | v2 | Li, Lulu; Kim, Sang-Wook; Iwai, Noriko; Fu, Yang-Chih |

Table A1: Source Survey Information (*continued*)

| Survey | Range | Version | Primary Creator/Maintainer |
|------------------------------------|-----------|--|---|
| Eurobarometer | 1982-2022 | v1.0.1, v1.0.1, v2.0.0, v1.1.0, v2.1.0, v3.0.0, v4.0.0, v2.0.0, v1.0.0 | Commission of the European Communities, Brussels; European Commission, Brussels; DG X - Information Communication Culture Surveys Research Analyses, European Commission, Brussels; DG X - Information Communication Culture Surveys Research Analyses; European Commission, Brussels; DG X - Information Communication Culture Surveys Research Analyses; European Commission, Brussels; DG X - Information Communication Culture Public Opinion Surveys and Research Unit; European Commission, Brussels DG Press and Communication Opinion Polls; European Commission, Brussels; DG Communication Public Opinion Analysis Sector; Papacostas, Antonis; Papacostas, Antonis; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Commission, Brussels; DG Communication; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Commission, Brussels; Directorate General Communication (COMM.A.2. 'Research and Speechwriting'); European Commission, Brussels; Directorate General Communication COMM.A.1 'Strategy, Corporate Communication Actions and Eurobarometer'; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Commission, Brussels; Directorate General Communication, COMM.A.1 'Strategic Communication'; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Commission, Brussels; Directorate General Communication, COMM.A.3 'Media monitoring, media analysis and Eurobarometer'; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit; European Commission, Brussels; Directorate General Communication, COMM.A.3 'Media Monitoring and Eurobarometer'; European Commission, Brussels; Directorate General Communication, COMM.A.3 'Media Monitoring and Eurobarometer'; European Parliament, Directorate-General for Communication, Public Opinion Monitoring Unit |
| European Election Studies | 1989-2019 | v1.0.0, v2.0.0 | Eijk, C. van der; Oppenhuis, Erik; Schmitt, Hermann; Castillo, Pilar del; Eijk, Cees van der; Franklin, Mark; Eijk, C. van der, Franklin, M., Schoenbach, K., Schmitt, H. , Semetko, H. , with; Brug, W. van der , Holmberg, S. , Mannheimer, R., Marsh, M., Thomassen, J., Wessels, B., International Research Group "European Election Studies", IPSOS, Hamburg, Germany (primary investigator); Schmitt, Hermann; Bartolini, Stefano; Brug, Wouter van der; Forschungsgruppe Wahlen, Mannheim; Reinl, Ann-Kathrin; Braun, Daniela |
| European Social Survey (ESS) | 2002-2022 | r1, r10, r2, r3, r4, r5, r6, r7, r8, r9 | Roger Jowell, NatCen; Rory Fitzgerald; Roger Jowell |
| European Values Study | 1981-2020 | v5.0.0, v3.0.0 | Gedeshi, Ilir; Pachulia, Merab; Poghosyan, Gevorg; European Values Systems Study Group (EVSSG); Zulehner, Paul M.; Dobbelaere, Karel; Kerkhofs, Jan; Zulehner, Paul M.; Rotman, David; Titarenko, Larissa; Gedeshi, Ilir; Zulehner, Paul M.; Rotman, David |
| German General Social Survey | 2021 | v2.0.0 | Westle, Bettina; Auspurg, Katrin; Buhler, Christoph |
| German Longitudinal Election Study | 1983-2017 | v2.0.0, v1.1.0 | Hans Rattinger, Harald Schoen |
| Global Indicators | 1987-2003 | | Pew Research Center |

Table A1: Source Survey Information (*continued*)

| Survey | Range | Version | Primary Creator/Maintainer |
|---------------------------------------|-----------|---|--|
| Governance Survey | 2015 | | Pew Research Center |
| Icelandic National Election Study | 1983-2013 | v1, v3 | Hardarson, Olafur THordur; Felagsvisindastofnun; Hardarson, Olafur THordur; Eva Heida Onnudottir; Einar Mar THordarson; Felagsvisindastofnun; Hardarson, Olafur THordur; Eva Heida Onnudottir; Einar Mar THordarson; Felagsvisindastofnun; Hardarson, Olafur THordur; Onnudottir, Eva Heida; THordarsson, Einar Mar; Felagsvisindastofnun; Hardarson, Olafur THordur; Hulda THorisdottir; Eva Heida Onnudottir |
| International Social Survey Programme | 1990-2018 | v1.0.0, v2.1.0, v1.3.0, v2.0.0, v2.3.0, v4.0.0 | Kelley, Jonathan; Lew1n-Epstein, Noah; Bean, Clive; Evans, Mariah; Bean, Clive; Kelley, Jonathan; Kelley, Jonathan; Evans, Mariah; Haller, Max; Kelley, Jonathan; Evans, Mariah; Dimova, Lilia; Ahmad, Qazi K.; Dimova, Lilia; Frizzell, Alan; Kelley, Jonathan; Evans, Mariah; Hollinger, Franz; Gibson, Rachel K.; Haller, Max; Hadler, Markus; wllson, Shaun; Gibson, Rachel; Hadler, Markus; Gibson, Rachel; wllson, Shaun; Dimova, Lilia; Philips, Timothy; Mitchell, Deborah; Pammett, Jon H.; Haller, Max; Jorrat, Jorge Raul; Tranter, Bruce; Hollinger, Franz; Haller, Max; Evans, Ann; Jorrat, Jorge Raul; Evans, Ann; Haller, Max; Plecita, Klara; Lund Clement, Sanne; Andersen, Johannes; FORS swlss foundation for research in social sciences, c/o University of Lausanne, Switzerland; Gonzalez, Ricardo; Lyons, Pat; Carton, Ann; Vanderkelen, Francoise; Gonzalez, Ricardo; FORS, c/o University of Lausanne, Lausanne, Switzerland; Gonzalez, Ricardo; Mansfeldova, Zdenka; Muckenhuber, Johanna; Hollinger, Franz; Hadler, Markus; Muckenhuber, Johanna; Hadler, Markus; Hollinger, Franz |
| Internet and Technology | 2012 | | Pew Research Center |
| Italian National Election Studies | 1985-2018 | | Istituto Cattaneo |
| KoreaBarometer | 1994-2010 | | Doh Chull Shin, Chong-Min Park |

Table A1: Source Survey Information (*continued*)

| Survey | Range | Version | Primary Creator/Maintainer |
|---|-----------|---|---|
| LAPOP AmericasBarometer | 2006-2021 | v15.2.4.2, v10.0.3.3, v15.2.3.0, v18.0.7.0, v12.0.6.2, v15.2.3.2, v18.0.4.1, v12.0.5.0, v18.0.5.6, v11.2.7.1, v10.2, v10.0.4.0, v15.2.2.0, v18.0.6.1, v11.2.7.1., v10.0.3.2, v18.0.6.0, v11.1.7.0, v9.0.5.2, , v11.0.5.0, v9.0.5.1, v14.0.3.2, v15.2.5.1, v11.1.3.2, v15.2.4.3, v15.2.6.0, v18.0.2.2, v15.2.4.4, v10.0.2.2, v8.8, v18.0.4.0, v12.0.3.0, v10.0.1.2, v15.2.5.2, v18.0.3.1, v12.0.7.0, v17.5.4.3, v10.0.2.3, v14.0.2.6 | Elizabeth Zechmeister; German Lodola; Daniel Moreno; Simone Bohne; Keith Neuman; Juan Pablo Luna; Juan Carlos RodrA-guez-Raga; Mitchell A. Seligson Kelly, Juan Carlos Donoso, Ricardo CA ³ rdova, Dinorah Azpuru, Lawrence Lachmansingh, Dominique ZA(C)phyr, Orlando PA(C)rez, Balford Lew1s, Pablo ParA1s, Orlando PA(C)rez, Orlando PA(C)rez, Manuel Orrego, Julio CarriA ³ n, Mitchell A. Seligson, MarA-a Fernanda Boidi, Damarys Canache; NA; Jorge Vargas Cullell; Juan Carlos Donoso; Dinorah Azpuru; Orlando PA(C)rez; Elizabeth Zechmeister; Mitchell A. Seligson; Dominique ZA(C)phyr; MarA-a Fernanda Boidi; Damarys Canache |
| Latinobarometro | 1995-2020 | v20190707 | Corporacion Latinobarometro |
| National Social Science Survey | 1984-1995 | v2, v1 | Kelley, Jonathan; Cushing, Robert; Headey, Bruce; Kelley, Jonathan; Bean, Clive; Evans, Mariah D. R.; Kelley, Jonathan; Bean, Clive; Evans, Mariah, 2017; Kelley, Jonathan; Bean, Clive; Evans, Mariah D. R.; Zagorski, Krzysztof |
| New Europe Barometer (NEB) Surveys | 1992-2007 | v2, v3, v4, v5, v6, v7 | The Centre for the Study of Public Policy and the Paul Lazarsfeld Society, Vienna |
| New Zealand Election Study | 1993-2020 | v6, v3 | Vowles, Jack; Aimer, Peter; Catt, Helena; Miller, Raymond; Lamare, Jim; Vowles, Jack; Banducci, Susan; Karp, Jeffrey; Aimer, Peter; Catt, Helena; Miller, Raymond; Denmark, D; Vowles, Jack; Banducci, Susan; Karp, Jeffrey; Miller, Raymond; Sullivan, Ann; Vowles, Jack; Banducci, Susan; Karp, Jeffrey; Miller, Raymond; Sullivan, Ann; Curtin, Jennifer; Vowles, Jack; Cotterell, Gerard; Miller, Raymond; Curtin, Jennifer; Vowles, Jack; Coffe, Hilde; Curtin, Jennifer; Cotterell, Gerard; Vowles, Jack; McMillan, Kate; Barker, Fiona; Curtin, Jennifer; Hayward, Janine; Greaves, Lara; Crothers, Charles; Vowles, Jack; Barker, Fiona; Krewel, Mona; Hayward, Janine; Curtin, Jennifer; Greaves, Lara; Oldfield, Luke |
| Norwegian Election Study | 1977-2009 | | Institute of Social Research, Oslo (ISF) |
| Norwegian Sámi Parliamentary Election Study | 2013 | | Saglie, Jo |
| OECD Economic Surveys | 1999-2007 | | Oecd |

Table A1: Source Survey Information (*continued*)

| Survey | Range | Version | Primary Creator/Maintainer |
|--|-----------|---|--|
| Polish General Social Survey (PGSS) Series | 1992-2010 | v1 | Bogdan Cichomski, Tomasz Jerzynski, Marcin Zielinski |
| Politbarometer | 1977-2016 | v15.0.0 | Forschungsgruppe Wahlen, Mannheim |
| Political Culture of Democracy | 2009-2011 | v10.1b, v11, v10.1h, v19, v1, v10.2a i, v10.0 | NA; Daniel Moreno; Juan Pablo Luna; Juan Carlos RodrA-guez-Raga; Dominique ZA(C)phyr; Damarys Canache |
| Political Typology | 2004-2017 | | Pew Research Center |
| Politics and Policy | 2016 | | Pew Research Center |
| Portugal Elections and Political Representation | 2012-2018 | p2, p3 | Andre Freire, Jose Manuel Leite Viegas , Ana Maria Belchior, and Marco Lisi; Andre Freire, Emmanouil Tsatsanis |
| Religion Datasets | 2014 | | Pew Research Center |
| Religious Landscape Survey | 2007 | | Pew Research Center |
| South Asian Barometer Survey | 2013 | w2 | Hu Fu Center for East Asia Democratic Studies |
| Swedish National Election Studies (SNES) | 1988-2018 | v1 | Andersson, D., Hedberg, P., Svensson, R., Oscarsson, H. |
| Values and Political Change in Post-Communist Europe | 1993 | e1 | Heywood, P., University of Glasgow, Department of Politics Miller, W. L., University of Strathclyde, Department of Politics White, S., University of Glasgow, Department of Politics |
| World Values Survey | 1981-2022 | w1, w2, w3, w4, w5, w6, w7 | Inglehart, R., Haerpfer, C., Moreno, A., Welzel, C., Kizilova, K., Diez-Medrano J., M. Lagos, P. Norris, E. Ponarin, B. Puranen |

Table A2: Indicators Used in the Latent Variable Model of Macroiinterest

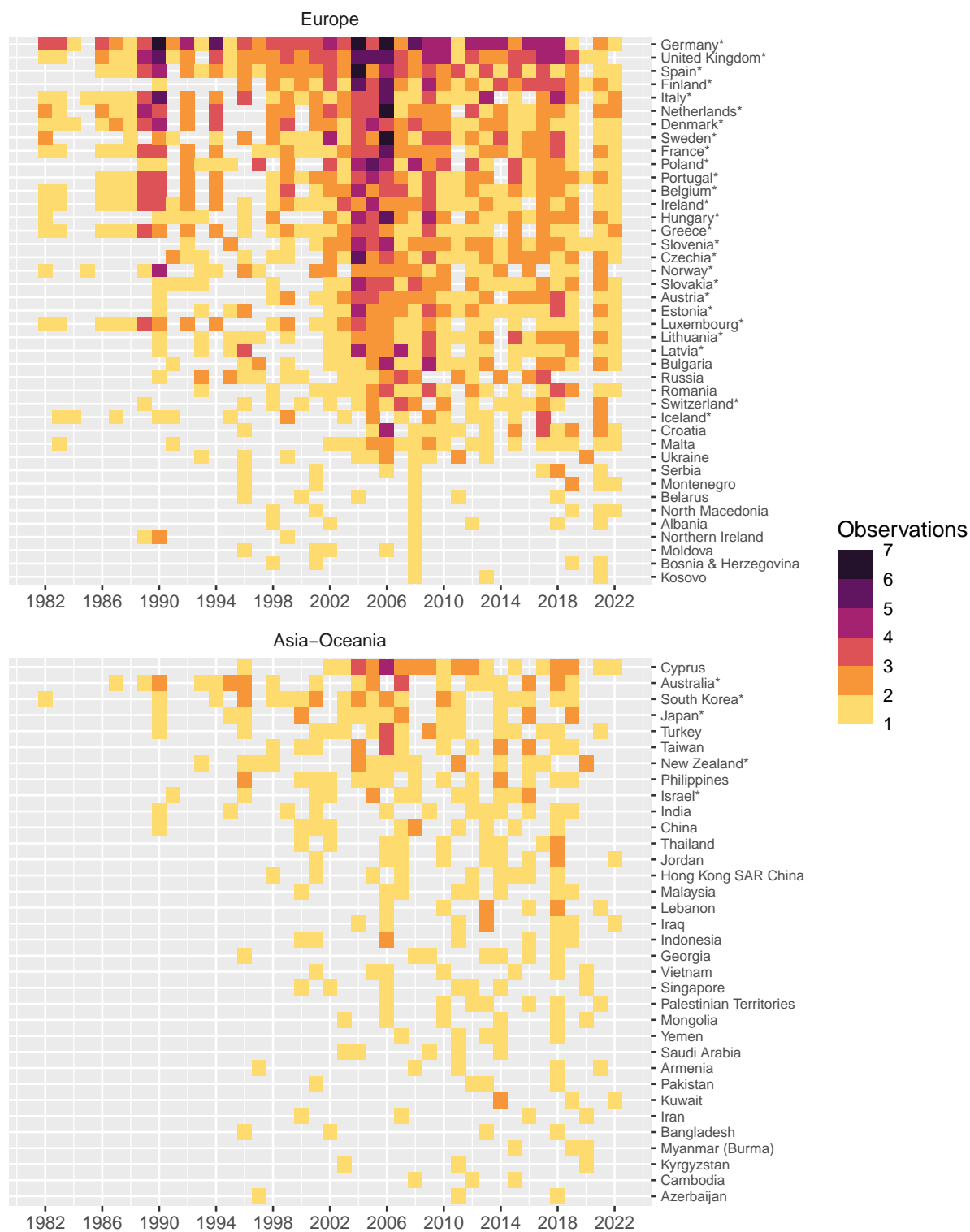
| Country- Question Text Years | Response Categories | Dispersion | Difficulties |
|--|---|------------|-------------------------|
| 285 How interested would you say you are in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.72 | -0.63, 0.81, 2.68 |
| 253 How interested are you in politics? | 1 Very interested / 2 Quite interested / 3 Hardly interested / 4 Not at all interested | 0.65 | -0.42, 1.00, 2.65 |
| 246 How interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 A little interested / 4 Not at all interested | 0.99 | -0.74, 1.13, 3.09 |
| 168 Would you say that you are very interested, fairly interested, not very interested or not at all interested in European affairs? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.73 | -0.85, 0.75, 2.90 |
| 166 How interested are you in politics? | 1 A lot / 2 Some / 3 Little / 4 None | 1.05 | -1.09, 0.90, 2.86 |
| 136 How interested would you say you are in politics? | 1 Very interested / 2 Somewhat interested / 3 Not very interested / 4 Not at all interested | 1.01 | -0.80, 0.93, 3.23 |
| 126 Let us talk about those issues in the news which interest you. For each issue I read out, tell me if you are very interested, moderately interested or not at all interested in it. Politics | 1 Very interesting / 2 Moderately interesting / 3 Not at all interesting | 0.83 | -0.39, 2.01 |
| 117 To what extent would you say you are interested in politics? | 1 A great deal / 2 To some extent / 3 Not much / 4 Not at all | 0.55 | -0.46, 0.85, 2.32 |
| 108 Some people are very interested in politics. Others are not interested at all. Are you very interested in politics, or are you not at all interested? | 1 Very interested / 2 A lot / 3 More or less / 4 A little / 5 None | 0.74 | -0.99, 0.32, 1.64, 3.13 |
| 106 How interested would you say you personally are in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.63 | -0.57, 0.90, 2.67 |
| 100 How interested are you in politics and government? | 1 Very interested / 2 Somewhat interested / 3 Now and then / 4 Not interested | 0.58 | -0.89, 0.33, 2.00 |

Table A2: Indicators Used in the Latent Variable Model of Macrointerest (*continued*)

| Country- Years | Question Text | Response Categories | Dispersion | Difficulties |
|-------------------|--|---|------------|--------------------------|
| 74 | To what extent would you say you are interested in politics? | 1 A great deal / 2 To some extent / 3 Not much / 4 Not at all | 0.80 | -0.65, 0.95, 2.82 |
| 63 | How interested would you say you are in politics? | 1 Not at all interested / 2 A little interested / 3 Somewhat interested / 4 Very interested | 0.79 | -0.63, 0.94, 2.98 |
| 59 | What sort of things in life interest you a lot? I am going to show you a list of things. which of these really interest you? Politics in [country] | 1 Mentioned / 2 Not mentioned | 1.34 | 2.49 |
| 52 | For each of the following propositions, please tell me if it rather corresponds or rather does not correspond to your attitude or your opinion. You are very interested in politics | 1 Yes, rather / 2 No, rather does not | 1.39 | 1.09 |
| 49 | Would you say that you are very, somewhat, not very or not at all interested in politics? | 0 Not at all interested / 1 Not very interested / 2 Somewhat interested / 3 Very interested | 0.58 | -0.64, 0.75, 2.37 |
| 35 | Generally speaking, how interested would you say you are in politics? | 1 Very interested / 2 Interested / 3 Little interested / 4 Not interested | 0.59 | -0.11, 1.29, 2.79 |
| 31 | How interested are you in politics? | 1 Very strong / 2 Strong / 3 Somewhat / 4 Hardly / 5 Not at all | 1.14 | -2.23, -0.83, 1.60, 3.85 |
| 31 | How interested are you in politics? | 1 Very interested / 2 Somewhat interested / 3 Not very interested / 4 Not at all interested | 1.01 | -0.53, 1.26, 3.58 |
| 30 | How interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.74 | -1.16, 0.39, 2.17 |
| 30 | How much interest do you have in politics? | 1 A great deal / 2 Quite a lot / 3 Some / 4 Not very much / 5 Not at all | 1.19 | -1.91, -0.04, 1.82, 3.79 |
| 29 | Would you say that you are very interested, fairly interested, not very interested or not at all interested in domestic affairs? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.49 | -0.98, 0.24, 1.83 |
| 28 | Please tell me if you are fairly interested or not in each of the following topics? Politics | 1 Interested / 2 Not interested | 0.93 | 0.90 |
| 27 | In which of the following news related issues are you most interested in...? Politics | 0 Not mentioned / 1 Mentioned | 0.92 | 1.38 |
| 27 | Some people follow what's going on in European Union politics, whether there's an election going on or not. Others aren't that interested. Would you say you follow what's going on in European Union politics: | 1 Most of the time / 2 From time to time / 3 Rarely / 4 Never or almost never | 1.25 | -1.96, 0.03, 2.74 |
| 25 | For each of the following statements, please tell me if it applies to you often, sometimes, rarely or never. I am interested in what is going on in politics | 1 Often / 2 Sometimes / 3 Rarely / 4 Never | 0.66 | -0.93, 0.15, 1.38 |
| 23 | Generally speaking, how interested would you say you are in politics? | 1 Very interested / 2 Interested / 3 Uninterested / 4 Very uninterested | 1.10 | 0.22, 1.97, 3.92 |
| 20 | How interested in politics are you? | 1 Very strongly / 2 Strongly / 3 Middling / 4 Very little / 5 Not at all | 1.14 | -1.83, -0.04, 2.27, 4.02 |
| 18 | How interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.50 | -0.73, 0.65, 1.67 |
| 18 | Some people seem to follow what's going on in government and public affairs most of the time, whether there's an election or not. Others aren't that interested. Would you say you follow what's going on in government and public affairs | 1 Most of the time / 2 Some of the time / 3 Only now and then / 4 Hardly at all | 0.68 | -1.46, -0.22, 1.21 |
| 16 | In everyday life, we have to deal with many different problems and situations, where we feel more or less interested and confident. I am going to read you a number of statements. I am interested in what is going on in politics | 1 Most of the time / 2 Some of the time / 3 Hardly any of the time | 0.75 | 0.02, 1.54 |
| 16 | How interested are you in public affairs? | 0 Not interested / 1 Somewhat interested / 2 Very interested | 0.72 | -0.84, 1.59 |

Table A2: Indicators Used in the Latent Variable Model of Macroiinterest (*continued*)

| Country- Question Text Years | Response Categories | Dispersion | Difficulties |
|---|--|------------|--|
| 15 I am interested in politics and follow it actively | 1 Strongly agree / 2 Agree to some extent / 3 Difficult to say / 4 Disagree to some extent / 5 Strongly disagree | 0.68 | -0.34, 0.68, 1.00, 2.29 |
| 15 How much interest do you usually have in what's going on in politics? | 1 A good deal / 2 Some / 3 Not much / 4 None | 0.75 | -1.63, 0.05, 1.91 |
| 13 Some people seem to follow | 1 Hardly at all / 2 Now and then / 3 Some of the time / 4 Most of the time | 0.95 | -1.11, 0.46, 2.33 |
| 12 In general, how interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.57 | -0.21, 1.11, 2.48 |
| 10 Some people seem to follow what's going on in government and public affairs most of the time, whether there's an election going on or not. Others aren't that interested. Would you say you follow what's going on in government and public affairs most of the time, some of the time, only now and then, or hardly at all? | 1 Most of the time / 2 Some of the time / 3 Only now and then / 4 Hardly any of the time | 1.24 | -2.50, -0.95, 0.95 |
| 10 How interested are you in politics? | 1 Very much / 2 Somewhat / 3 A little / 4 Not at all | 0.09 | -0.18, 0.74, 1.80 |
| 10 How interested would you say you personally are in politics? | 1 Extremely interested / 2 Very much interested / 3 Fairly interested / 4 A little interested / 5 Not at all interested | 0.82 | -0.98, 0.36, 2.35, 3.73 |
| 9 How interested are you in politics? | 1 Very / 2 Somewhat / 3 Only a little / 4 Not at all | 0.58 | -0.58, 1.03, 2.49 |
| 9 How interested would you say you personally are in politics? | 1 Very interested / 2 Fairly interested / 3 Not very interested / 4 Not at all interested | 0.73 | -0.78, 1.06, 2.97 |
| 9 Do you consider your interest in politics... | 1 Very great / 2 Great / 3 Some / 4 Little / 5 None | 0.76 | -1.30, 0.40, 2.17, 3.47 |
| 8 Generally speaking, you are interested in politics | 1 Yes, very strongly / 2 Yes, strongly / 3 Yes, not so strongly / 4 No, not especially / 5 No, not at all | 0.47 | -0.46, 0.53, 1.64, 2.75 |
| 8 How interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 Not interested | 0.36 | 0.46, 2.11 |
| 8 In general, how interested are you in politics? | 1 Very interested / 2 Fairly interested / 3 A little interested / 4 Not at all interested | 0.61 | -0.92, 0.82, 2.57 |
| 8 How interested would you say you personally are in politics? | 1 Very interested / 2 Somewhat interested / 3 Slightly / 4 Not at all | 0.46 | -0.94, 0.62, 1.99 |
| 7 How interested are you in politics generally? | 0 No interest at all / 123456789 / 10 A great deal of interest | 0.86 | -1.62, -1.24, -0.72, -0.24, 0.16, 0.84, 1.35, 2.10, 3.10, 3.79 |
| 7 How interested are you in politics these days? | 1 A lot / 2 Some / 3 Not much / 4 Not at all | 0.71 | -0.78, 0.68, 2.19 |
| 6 How interested would you say you are in politics? | 1 I take an active interest in politics / 2 I am interested in politics but don't t / 3 My interest in politics is not greater / 4 I'm not interested in politics at all | 0.76 | -0.54, 0.91, 3.05 |
| 5 How interested are you in politics? | 1 Very interested / 2 Quite interested / 3 Only a little interested / 4 Not at all interested | 0.68 | -0.71, 1.17, 2.84 |



Starred countries are OECD democracies, the sample employed in the analysis of macrointerest presented in the main text.

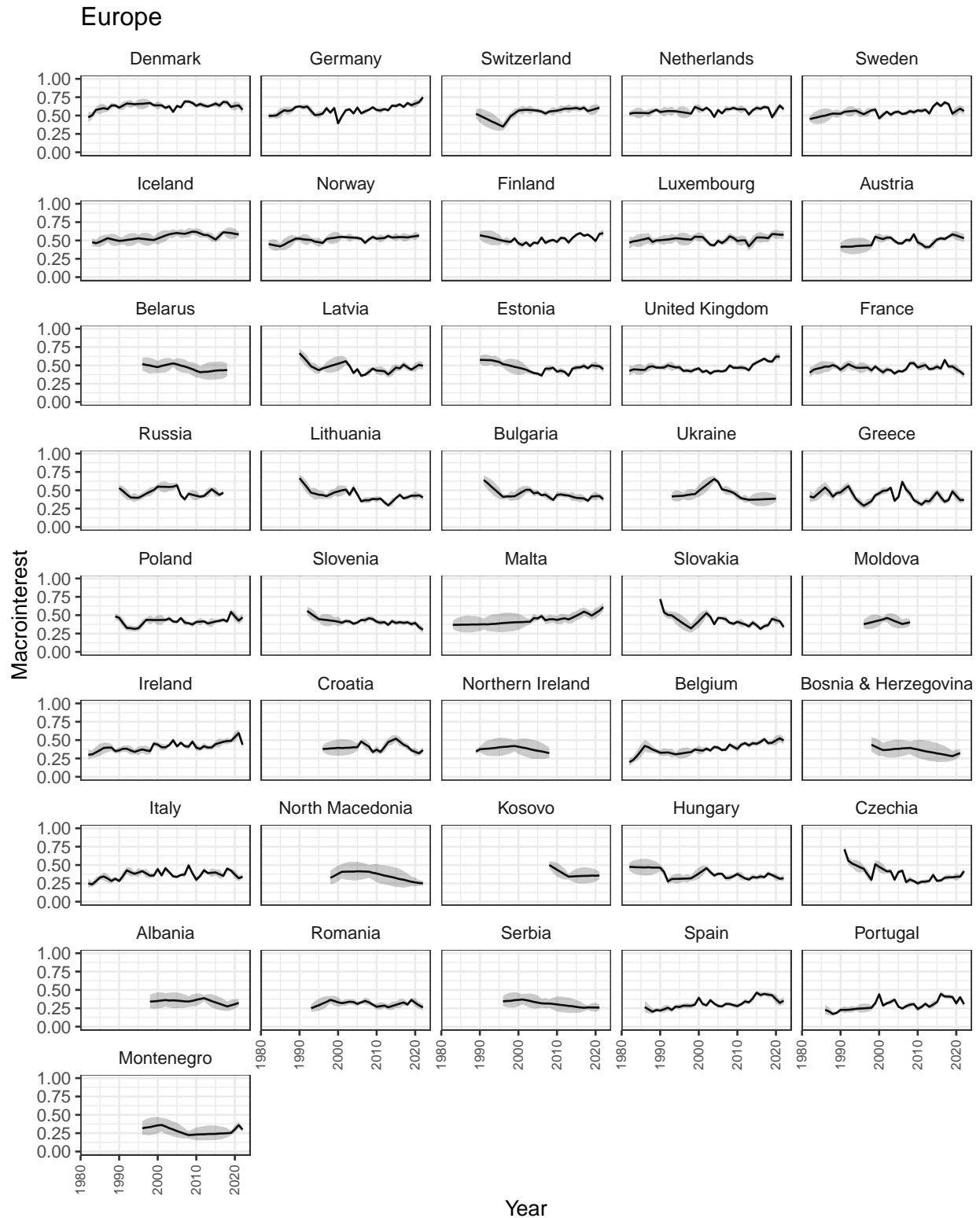
Figure A1: Source Data Observations by Country and Year



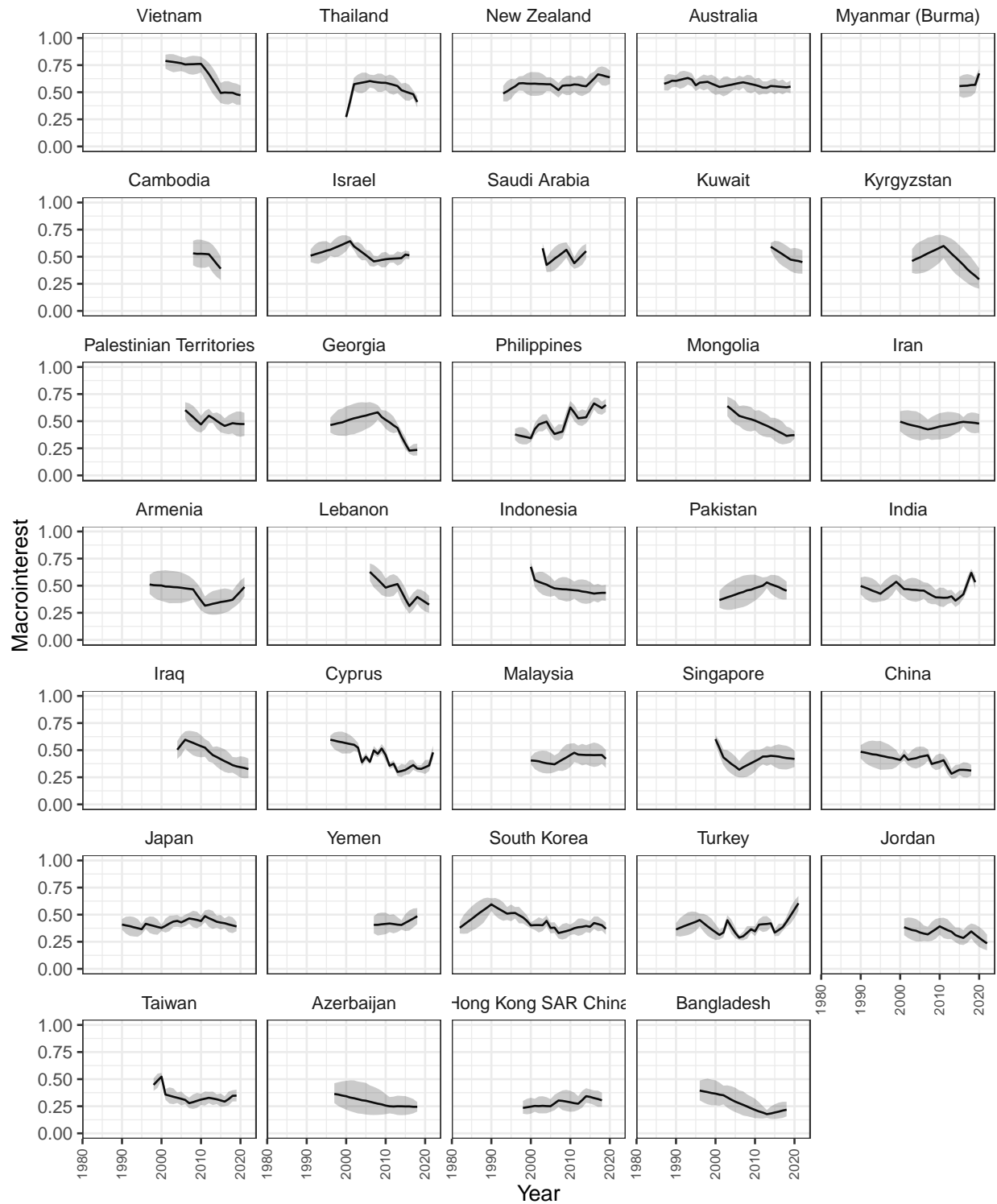
Starred countries are OECD democracies, the sample employed in the analysis of macrointerest presented in the main text.

Figure A2: Source Data Observations by Country and Year, cont.

B Macroiinterest Scores Over Time

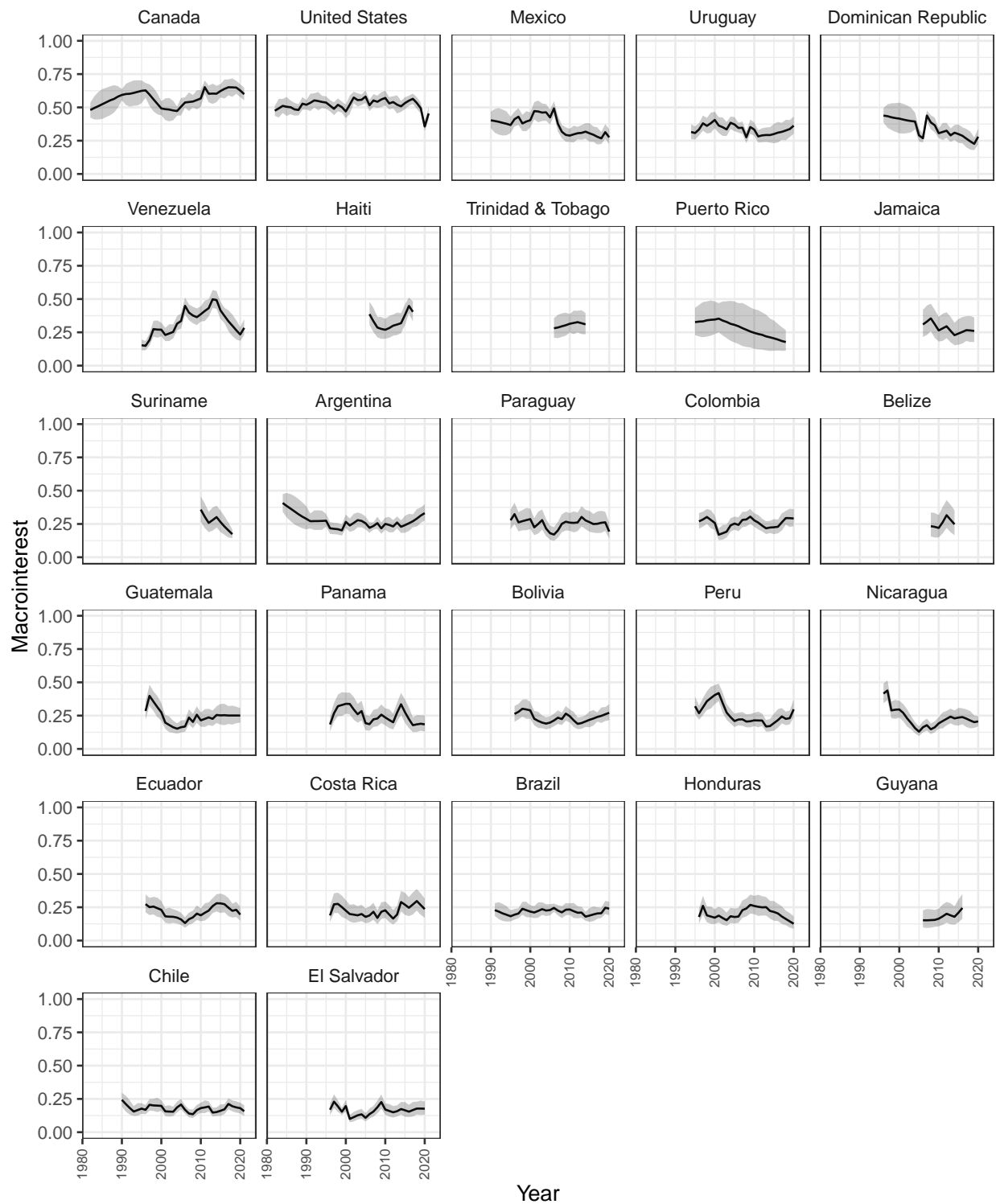


Asia–Oceania



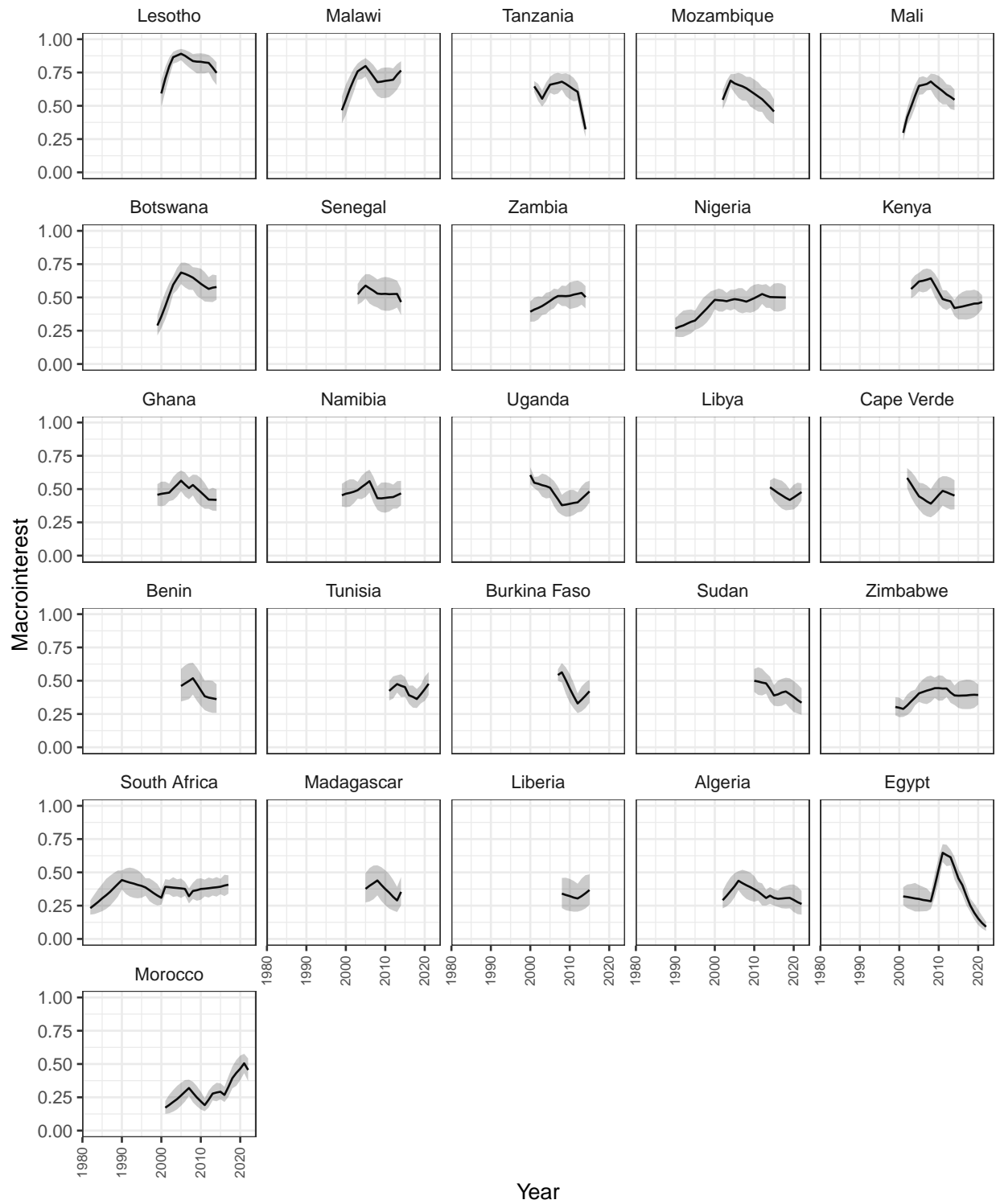
Note: Countries are ordered by their median macrointerest score; gray shading represents 80% credible intervals.

Americas



Note: Countries are ordered by their median macrointerest score; gray shading represents 80% credible intervals.

Africa



Note: Countries are ordered by their median macrointerest score; gray shading represents 80% credible intervals.

C The DCPO Model

A number of recent studies have developed latent variable models of aggregate survey responses based on cross-national survey data (see Claassen 2019; Caughey, O’Grady, and Warshaw 2019; McGann, Dellepiane-Avellaneda, and Bartle 2019; Kolczynska et al. 2020). To estimate macrointerest across countries and over time, we employ the latest of these methods that is appropriate for data that is not only incomparable but also sparse, the Dynamic Comparative Public Opinion (DCPO) model elaborated in Solt (2020b). The DCPO model is a population-level two-parameter ordinal logistic item response theory (IRT) model with country-specific item-bias terms.

DCPO models the total number of survey responses expressing at least as much macrointerest as response category r to each question q in country k at time t , y_{ktqr} , out of the total number of respondents surveyed, n_{ktqr} , using the beta-binomial distribution:

$$a_{ktqr} = \phi \eta_{ktqr} \quad (1)$$

$$b_{ktqr} = \phi(1 - \eta_{ktqr}) \quad (2)$$

$$y_{ktqr} \sim \text{BetaBinomial}(n_{ktqr}, a_{ktqr}, b_{ktqr}) \quad (3)$$

where ϕ represents an overall dispersion parameter to account for additional sources of survey error beyond sampling error and η_{ktqr} is the expected probability that a random person in country k at time t answers question q with a response at least as interested as response r .¹

This expected probability, η_{ktqr} , is in turn estimated as follows:

$$\eta_{ktqr} = \text{logit}^{-1}\left(\frac{\bar{\theta}'_{kt} - (\beta_{qr} + \delta_{kq})}{\sqrt{\alpha_q^2 + (1.7 * \sigma_{kt})^2}}\right) \quad (4)$$

In this equation, β_{qr} represents the difficulty of response r to question q , that is, the degree of political the response expresses. The δ_{kq} term represents country-specific item bias: the extent to which all responses to a particular question q may be more (or less) difficult in a given country k due to translation issues, cultural differences in response styles, or other idiosyncrasies that render the same survey item not equivalent across countries.² The dispersion of question q , its noisiness in relation to the latent variable, is α_q . The mean and standard deviation of the unbounded latent trait of macrointerest are $\bar{\theta}'_{kt}$ and σ_{kt} , respectively.

¹The ordinal responses to question q are coded to range from 1 (expressing the least political interest) to R (expressing the most political interest), and r takes on all values greater than 1 and less than or equal to R .

²Estimating δ_{kq} requires repeated administrations of question q in country k , so when responses to question q are observed in country k in only a single year, the DCPO model sets δ_{kq} to zero by assumption, increasing the error of the model by any country-item bias that is present. Questions that are asked repeatedly over time in only a single country pose no risk of country-specific item bias, so δ_{kq} in such cases are also set to zero.

Random-walk priors are used to account for the dynamics in $\bar{\theta}'_{kt}$ and σ_{kt} , and weakly informative priors are placed on the other parameters.³ The dispersion parameters α_q are constrained to be positive and all survey responses are coded with high values indicating more political interest to fix direction. The difficulty β of “to some extent” (the third response on the four-point, “not at all” to “a great deal” scale) to the European Social Survey’s question “To what extent would you say you are interested in politics?” is set to 1 to identify location, and for each question q the difficulties for increasing response categories r are constrained to be increasing. The sum of δ_{kq} across all countries k is set to zero for each question q :

$$\sum_{k=1}^K \delta_{kq} = 0 \quad (5)$$

Finally, the logistic function is used to transform $\bar{\theta}'_{kt}$ to the unit interval and so give the bounded mean of macrointerest, $\bar{\theta}_{kt}$, which is our parameter of interest here (see Solt 2020b, 3–8).

The DCPO model accounts for the incomparability of different survey questions with two parameters. First, it incorporates the *difficulty* of each question’s responses, that is, how much political interest is indicated by a given response. That each response evinces more or less of our latent trait is most easily seen with regard to the ordinal responses to the same question: indicating that one is “strongly interested” exhibits more political interest than stating one is “fairly interested,” which is a more interested response than “not very interested,” which in turn is more interested than “not at all.” But this is also true across questions. For example, indicating that politics is among “the sort of things in life interest you a lot” likely expresses even more interest than agreeing that one is interested in politics “most of the time.” Second, the DCPO model accounts for each question’s *dispersion*, its noisiness with regard to our latent trait. The lower a question’s dispersion, the better that changes in responses to the question map onto changes in macrointerest. Together, the model’s difficulty and dispersion estimates work to generate comparable estimates of the latent variable of macrointerest from the available but incomparable source data.

To address the sparsity of the source data—the fact that there are gaps in the time series of each country, and even many observed country-years have only one or few observed items—DCPO uses simple local-level dynamic linear models, i.e., random-walk priors, for each country. That is, within each country, each year’s value of macrointerest is modeled as the previous year’s estimate plus a random shock. These dynamic models smooth the

³The dispersion parameters α_q are drawn from standard half-normal prior distributions, that is, the positive half of $N(0, 1)$. The first difficulty parameters for each question, β_{q1} , are drawn from standard normal prior distributions, and the differences between β s for each r for the same question q are drawn from standard half-normal prior distributions. The item-bias parameters δ_{kq} receive normally-distributed hierarchical priors with mean 0 and standard deviations drawn from standard half-normal prior distributions. The initial value of the mean unbounded latent trait for each country, $\bar{\theta}'_{k1}$, is assigned a standard normal prior, as are the transition variances $\sigma_{\bar{\theta}'}^2$ and σ_{σ}^2 ; the initial value of the standard deviation of the unbounded latent trait for each country, σ_{k1} , is drawn from a standard lognormal prior distribution. The overall dispersion, ϕ , receives a somewhat more informative prior drawn from a gamma(4, 0.1) distribution that yields values that are well scaled for that parameter.

estimates of macrointerest over time and allow estimation even in years for which little or no survey data is available, albeit at the expense of greater measurement uncertainty.

It is noteworthy that the quality of DCPO estimates partly hinges on the source data's quality. While extensive data input and the Bayesian process might mitigate issues from problematic sources, other Total Survey Error aspects, notably representation errors, can still influence outcomes and lead to comparison errors. DCPO addresses measurement scale inconsistencies across surveys; however, variations in population definitions (such as age range, minority inclusion, and territorial exclusions) and sample designs (like probability versus non-probability samples, and older surveys' reliance on quota or random route samples without enumeration) remain a concern. These variations in data collection processes affect representation levels, impacting the estimation of broader interests like macrointerest.

DCPO can adjust for sampling biases using survey weights. However, for unweighted surveys, it doesn't offer a specific solution. Methodologically, leveraging census or other population data to correct biases is feasible (as demonstrated by Caughey and Warshaw (2015) in their DGIRT model). The trade-off is much longer time and much higher requirement of calculation power to converge the results. (As Caughey and Warshaw (2015, n. 8) indicated, the run times for the method incorporating census-based correction "ranged between a day and several weeks.") Additionally, not all surveys have suitable population data for correction, posing a challenge in balancing information richness against data representation. In this study, we applied weighing to surveys with weights through DCPO but did not specifically adjust for those without.

We urge researchers using DCPO in future projects to pay close attention to the sample design of the source data (e.g., the documentation of Latinobarometro states that some samples cover less than 20% of the given country) and be mindful of the potential risks of Total Survey Errors from including all available data. We also encourage further scholarly examination of our findings' robustness through alternative source data selection strategies.

D Test the Sources of Macrointerest Variances in OECD countries

After creating the cross-sectional time-series macrointerest, we tested theories of macrointerest formation in thirty-seven democracies of the OECD. Most macrointerest formation-modification theories assume stable and enduring democratic institutions. OECD countries are generally characterized by stable political systems and developed economies. This stability provides a consistent backdrop for analyzing how macrointerests form and evolve over time, minimizing the impact of extreme political or economic upheavals that could skew data in less stable contexts. While the OECD countries commit to democratic governance and market-based economies, there are also sufficient cultural, political, socioeconomic, and geographic diversities among them. This combination of diversity and comparability allows for robust cross-national studies and the testing of theories across different yet relatable settings. The high quality political and socioeconomic data of these countries also reduce the influence of measurement error and data sparseness on the analytic outcomes.

While most OECD countries have rich data, they are not always yearly continuous. Nor

are the datasets are comparable. DCPO helps to maximize the useful information from these sparse data and achieve a full time-range cross-sectional examination of the theoretical inferences. Figure A3 visualize the increment DCPO yields in comparison with one of the largest and oft-used dataset for OECD countries, the European Election Survey (EES). The year ranges covered by ESS is marked as the light bars by year, and those DCPO can offer are marked dark. DCPO not only fills all the empty years absent from EES but also extend the data availability beyond Europe to the entire rank of OECD countries and from 1982 to 2022.

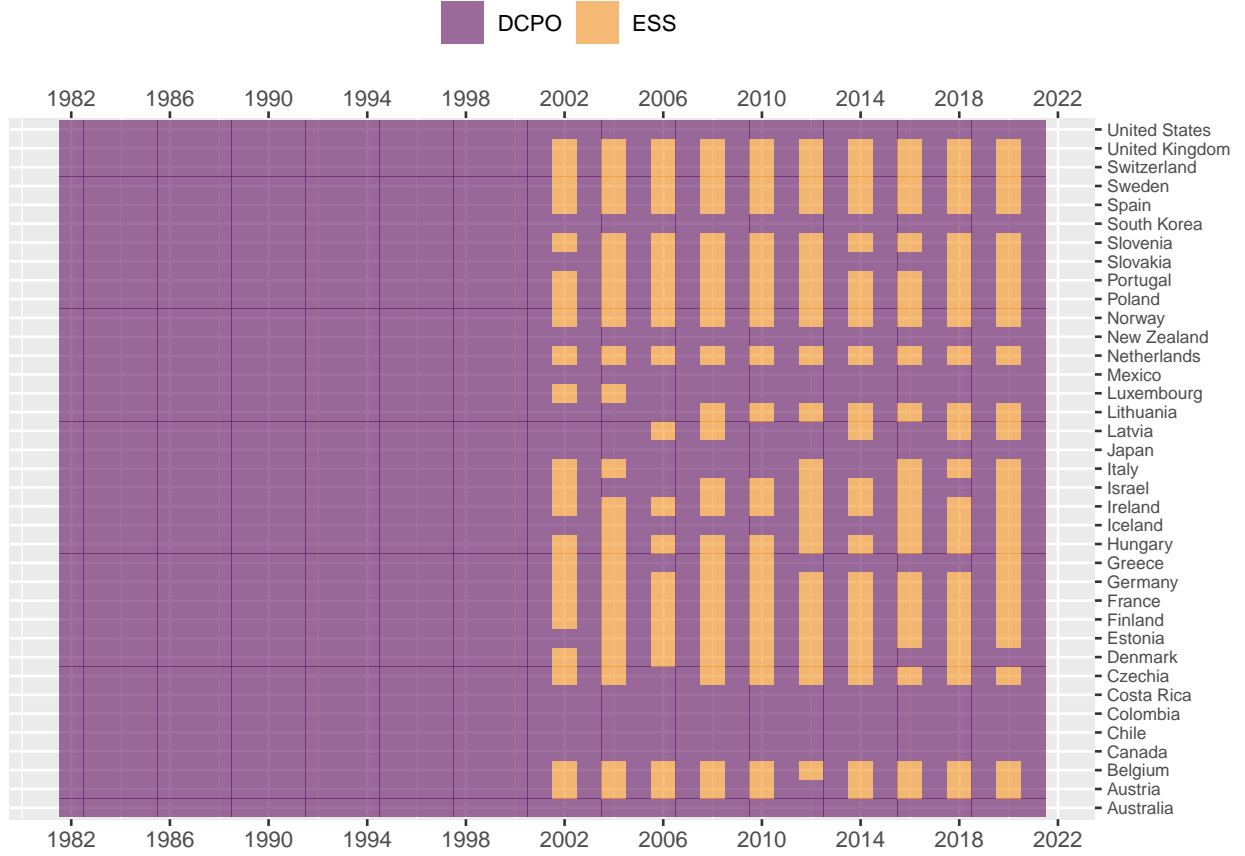


Figure A3: Data Availability: DCPO vs. ESS

Table A3 presents the hypothesis testing result based on this data. The result has been visualized in Figure 5 and discussed in the main text. We welcome future researchers to examine our findings on other country cases, especially those not commonly participating in the same survey program or have more sparse data. The examination requires more efforts on model specification to address the even larger socioeconomic and political variance among non-OECD countries.

Table A3: Numeric results of Figure 5

| | (1) |
|--------------------------------|----------------------------|
| Election Year | 0.763 [0.141, 1.399] |
| Parliamentarism | 3.854 [1.484, 6.287] |
| Federalism | 6.210 [−1.095, 13.332] |
| Disproportionality, Mean | −0.220 [−0.915, 0.466] |
| Disproportionality, Difference | −0.223 [−0.357, −0.096] |
| GDPpc, Mean | 0.178 [−0.082, 0.430] |
| GDPpc, Difference | 0.105 [0.032, 0.173] |
| GDP Growth, Mean | 0.825 [−1.623, 3.231] |
| GDP Growth, Difference | 0.066 [−0.068, 0.200] |
| Unemployment, Mean | −0.536 [−1.562, 0.488] |
| Unemployment, Difference | 0.035 [−0.084, 0.153] |
| Income Inequality, Mean | −0.573 [−1.039, −0.100] |
| Income Inequality, Difference | 0.034 [−0.219, 0.315] |
| Num.Obs. | 1197 |
| R2 | 0.819 |
| R2 Adj. | 0.770 |
| R2 Marg. | 0.446 |
| ELPD | −3940.4 |
| ELPD s.e. | 61.0 |
| LOOIC | 7880.7 |
| LOOIC s.e. | 121.9 |
| WAIC | 7867.8 |
| RMSE | 4.83 |
| r2.adjusted.marginal | −1 |

95-percent credible intervals are in brackets.

E Comparison with Peterson et al. (2022)

This study extends the pivotal concept of “macrointerest” from Peterson et al. (2022), yet diverges methodologically by employing the Dynamic Comparative Public Opinion (DCPO) model instead of the dynamic ratio algorithm, commonly referred to as “Wcalc,” as utilized in the original research (2022, 208). Apart from the primary rationale stated in the main article—that Wcalc is inherently tailored for generating public opinion time series within a single country rather than for cross-national comparison—there are also methodological and operational distinctions between these two approaches.

The dynamic ratio algorithm primarily seeks to uncover shared variance over time among various survey items. Its process involves initially pairing these items, subsequently calculating the ratio for each unique pair, and then analyzing the distribution of these ratios. DCPO instead directly models the relationship between the latent variable and survey item responses using a Bayesian Item Response Theory (IRT) approach. This method provides a probabilistic framework, enabling the estimation of response probabilities contingent on both the level of the latent trait and specific characteristics of the survey items.

Additionally, these methods adopt differing strategies for addressing missing data at certain time points. The dynamic ratio algorithm tackles this challenge by estimating values for unobserved series at each time point, basing these estimations on the calculated ratio of missing survey items to those observed in the corresponding period. For the same issue, DCPO, on the other hand, employs dynamic linear models at the local level for each country, leveraging random-walk priors. This approach not only smooths the estimates of macrointerest over time but also facilitates estimation in years characterized by limited or absent survey data, and simultaneously providing specific uncertainty estimates.

In application, as Peterson et al. (2022, 210) pointed out, to conduct the dynamic ratio algorithm, researchers have to remove or redistribute the responses of moderate opinions. Since modeling the item characteristics directly, DCPO does not need to twist the original item response. It can also yield the credible intervals of the estimates from the Bayesian process, rather than relying on the ex post bootstrapping for uncertainty estimation. DCPO additionally implements a logistic function to confine the outcome estimation within a unit interval. This bounding process can diminish the uncertainty of estimates for countries at the extremes. As highlighted by Linzer and Staton (2015, 229), “constraining the latent variable might have minimal impact on the scale, yielding more reasonable uncertainty estimates.”

In Figure A4, we compare the outcome from these two methods. In the left panel, we replicate Peterson et al. (2022)’s Figure 6 of the Wcalc scores of the U.S. macrointerest. We then bounded the Wcalc scores to the unit interval via a logistic transformation as DCPO does and calculate the 80% confidence intervals. The results is compared with the DCPO outputs in the shared time period (1982–2014) in the right panel of Figure A4. The variance of Wcalc scores become less observable when they are bounded relative to the standard error. DCPO, on the other hand, illustrates a more noticable variance in macrointerest over years and gains a better efficiency based on not only one but multiple countries’ data. In this sense, DCPO outcome brings stronger evidence for the original proposition of Peterson et al. (2022).

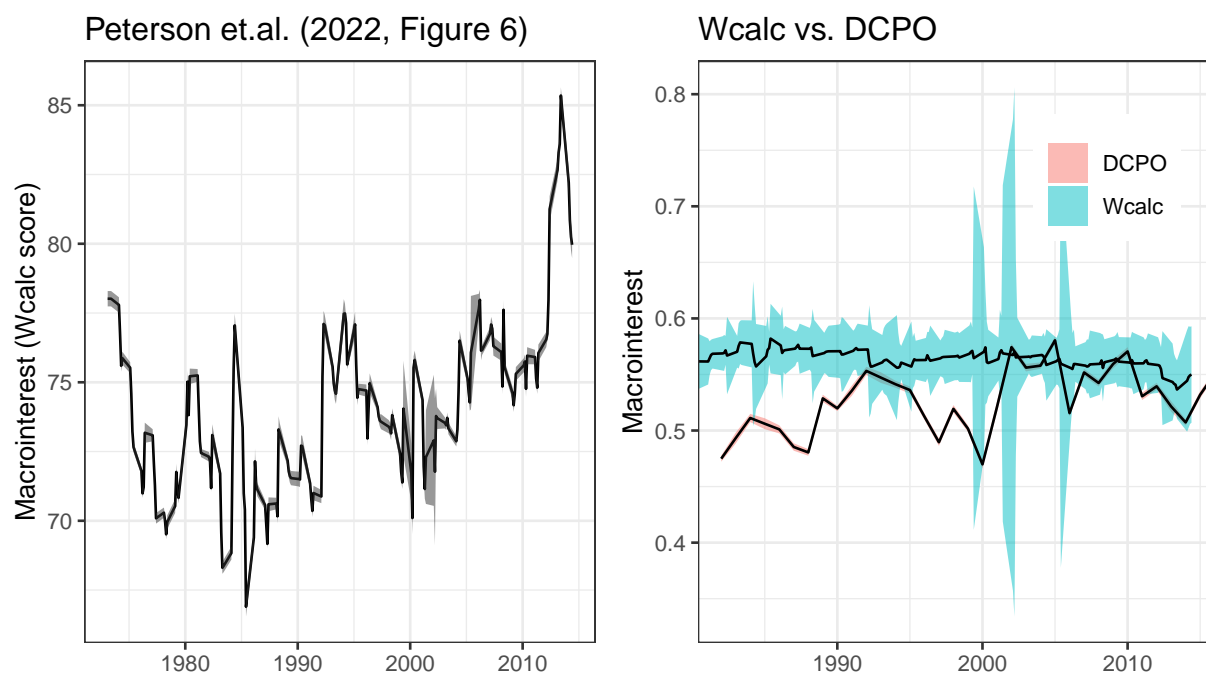


Figure A4: Comparison between DCPO and Wcalc

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