Dynamic Comparative Public Opinion*

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The study of public opinion in comparative context has been hampered by data that is sparse, that is, unavailable for many countries and years; incomparable, i.e., ostensibly addressing the same issue but generated by different survey items; or, most often, both. Questions of representation and of policy feedback on public opinion, for example, cannot be explored fully from a cross-national perspective without comparable time-series data for many countries that span their respective times of policy adoption. This paper proposes a latent variable approach to the study of comparative public opinion that maximizes the information gleaned from available surveys to overcome issues of missing and incomparable data and allow comparativists to examine the dynamics of public opinion. It then presents Bayesian techniques for estimating latent variables from cross-national survey data.

Keywords: public opinion, item response theory, measurement

A wealth of surveys provide information on the state of public opinion on various issues in different countries over the years, but scholars have faced significant hurdles to putting all of this information to use in any comparative study. The most challenging of these obstacles is that, across countries and over time, the questions asked regarding any given issue are rarely the same, making responses to these questions incomparable.

As a result, the most common approach to the study of comparative public opinion is to use a single cross-section, typically provided by a single cross-national survey (see, e.g., Dalton, Farrell and McAllister 2011, Ansell (2014)). Some works have captured some element of change over time by taking advantage of multiple waves of an ongoing cross-national survey (see, e.g., Inglehart 1997, Inglehart and Welzel (2005)) or, more rarely, drawing on multiple surveys that employed the same item (see, e.g., Solt 2011, Ezrow and Hellwig (2014)).

A growing body of work is taking a different tack, examining the dynamics of public opinion in single countries over time. These studies draw on

(Not using stimson: Hobolt2008, McGann2014, Stubager2015)

dynamic comparative: Hagemann2016

field of comparative public opinion lack of dynamics (in contrast to public opinion work in U.S.) Check out Thomassen2011 Russell Dalton's work Norris on trust (2011, 63-77)

problem: scarce data perennial problem of public opinion research: exact question wanted is rarely asked no (good) way to (fully) integrate what does exist

question of feedback: positive or negative? ("policies create constituencies" vs. thermostatic) under what conditions?

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A Method for Estimating Dynamic Comparative Public Opinion

solution: informed by recent efforts to improve data quality of cross-national time-series data on other latent concepts, such as democracy (Treier and Jackman 2008; Pemstein, Meserve, and Melton 2010, [Arel-Bundock and Mebane 2011]) and judicial independence (Linzer and Staton [2013]), I offer a Bayesian measurement model for comparative public opinion

priors for scarce data: Bailey (2001) Bayesian for missing data: Jackman (2000) random walk for flexibility: Linzer and Staton [2013] heteroskedastic ideal points: Lauderdale (2010) – actually not heteroskedastic (no gammas) no risk of outside raters doing a worse job with some countries because no outsiders: public opinion is what it is

Table 1: Comparing IRT Models of Aggregate Public Opinion

	McGann (2014)	Claassen (2019)	Caughley, O'Grady, and Warshaw (2019)	DCPO
Cross-National	No	Yes	Yes	Yes
Ordinal	No	No	Yes	Yes
Country-Varying Question Difficulty	No	Yes	No	Yes
Bounded	Yes	No	No	Yes
Country-Year Population Variance	Yes	No	No	Yes

Modeling Dynamic Comparative Public Opinion

Group IRT

The two-parameter logistic IRT model Mislevy (1983)

Ordinal

Cumulative logit

Country-Varying Question Difficulty

Responses to survey questions may vary across different countries not only as a result of differences in attitudes and preferences but also due to translation issues (see, e.g., Davidov and De Beuckelaer 2010), cultural differences in response styles (see, e.g., van Herk, Poortinga and Verhallen 2004), or other idiosyncrasies—recall Tarrow's (1971, 344) famous observation that the French understood survey questions regarding their "interest in politics" as inquiring about the strength of their partisan affiliations. Rather than simply allowing such problems of equivalence to contribute to the error of the model, they can be addressed explicitly by modeling the country-specific item bias (Stegmueller 2011), δ_{kq} . Claassen's (2019, 5-6) work employs this technique, and because estimating δ_{kq} requires data from repeated administrations of question q in country k, it discards survey data

that does not meet this requirement. DCPO also incorporates δ_{kq} to capture country-specific item bias, but it takes a slightly different approach that aims to maximize the incorporation of available survey data: when responses to question q are observed in country k in only a single year, δ_{kq} is set to zero by assumption. This means that incorporating these 'one-shot' surveys will come at the cost of increasing the error of the model by any country-item bias that is present.

Bounded

Previous efforts to measure cross-national aggregate public opinion as a latent variable have generated estimates on an unbounded scale with mean zero and unit variance (see Classen 2019, 14; Caughey, O'Grady and Warshaw 2019, 8). However, like many other concepts in political science (see Linzer and Staton 2015, 229), many aspects of public opinion are conceptually bounded, that is, it make sense to think of them as lying along a scale from fully absent to fully present in the relevant public. Take attitudes toward immigration as an example. One hypothetical country's citizens are absolutely opposed to any immigration, while another's are completely welcoming to migrants. Actual countries' levels of public opinion toward immigration are better understood not as unbounded but as falling somewhere between the bounds described by these two hypothetical countries. It is not surprising, then, that earlier works aggregating public opinion within a single country presented results on bounded scales (see Stimson 1991; McGann 2014). Even if the issue in question is less easily viewed as bounded, bounding is still a good idea because it reduces the uncertainty for the estimates for countries at the extremes, that is, those countries that should in fact be easier to estimate. As Linzer and Staton (2015, 229) write, "bounding the latent variable may do little harm to the scale and produce more sensible estimates of uncertainty." DCPO therefore bounds estimates of aggregate public opinion to range between zero and one.

Country-Year Population Variance

The probability of an individual i in country k at time t giving a response at least as positive as response r to question q is:

$$Pr(Y \ge r) = logit^{-1} \left(\frac{\bar{\theta}'_{kt} - (\beta_{qr} + \delta_{kq})}{\sqrt{\alpha_q^2 + \sigma_{kt}^2}} \right)$$
 (1)

%McGann2014, 125: "the IRT model has the added advantages of being better justified in terms of individual-level behavior and the additional parameters (the polarization of the population in terms of policy mood) are substantively interesting."

Adding Dynamics

Random walk priors for $\bar{\theta}_{kt}$ and σ_{kt}^2

Identification, Priors, and Estimation

For each question q, δ_{kq} are constrained to have mean equal to zero.

Conclusions

strengths: makes maximum use of available data permits testing hypotheses regarding change over time incorporates uncertainty

weaknesses: data collection demands challenges at individual level (but subsets)

Single-country studies of public opinion have flourished since the release of Stimson's (1991) algorithm for identifying the common trends in any collection of survey questions that have been repeatedly asked over many years. By extending this work to allow the creation of cross-national pooled time series that identify how public opinion varies both across countries and over time, DCPO has the potential to trigger a new wave of research on the causes and consequences of public opinion that will take into account the experiences of many countries.

Further, this allows a broadly comparative approach that is new to work on the relationship between opinion and policy. Existing studies on that examine this topic over time investigate only a single country or, much more rarely, a handful of countries. By examining a broad sample of democracies, DCPO helps researchers avoid conclusions based on the idiosyncrasies of any given political setting and provide a firmer grounding for our understanding of how democracies work and the threats to representation that they face.

model	mae	improv_over_cmmae
claassen	0.032	70.9
country means	0.11	
dgirt	0.055	70.4
country means	0.186	
depo	0.031	83.3
country means	0.186	

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