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Measuring public support for European integration using a Bayesian IRT model

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September, 2020



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Introduction

- In the recent years the European Union has experienced a growing politicisation and contestation
- Nowadays, public attitudes are central to:
 - Theories of European integration (Hooghe & Marks 2009)
 - Analysis of EU-level policy-making (Hagemann et al. 2017, Wratil 2018, 2019)
 - Studies of national-level party strategies (Hutter & Grande 2014, Reh et al. 2020, Rauh et al. 2020)

The paper addresses the problem of the measurement of public support for the EU.



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Concept definition

I adopt the two-dimensional conceptualisation of EU support put forward by De Vries (2018), which focuses on both the *procedural* and the *substantive* dimension of public support.

Existing measurement approaches

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Existing measurement approaches

Current approaches to the measurement of public attitudes towards the EU can be divided into two camps:

- The use of available single-question indicators:
 - Two paradigmatic examples could be the Eurobarometer "membership" question or the "preferred speed of integration" one.
- The combination of multiple indicators with dimension-reduction techniques.
 - Example: The Dyad Ratios algorithm (Stimson 1991). Similar to principal component analysis.

Limitations of existing approaches

- Single-question indicators:
 - Poor in accounting for possible multidimensionality of EU support
 - Very few indicators have been measured over long time periods
 - Data series have interruptions or question wording might change
- Dyad Ratios algorithm:
 - · Lacks an individual-level model of response
 - Cannot treat indicators with neutral or ordinal responses
 - Estimated series has an artificial metric.

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IRT models

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- For instance, if you've ever taken a GMAT or GRE test, you've been administered an IRT-based test!
- Individual-level IRT uses responses to different items to calculate respondent's "knowledge" (the attribute θ), by taking into account how difficult a given question is and how well it discriminates between "knowledgeable" and "unknowledgeable" respondents.

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- Imagine that:
 - We know that latent support in the population is normally distributed with mean μ and standard deviation σ , so that we can calculate the probability of drawing an individual with a certain amount of latent support
 - \bullet We know how difficult and how discriminatory question q is
 - The probability of answering a particular question in a pro-European way is a function of respondent's latent support and question's difficulty and discrimination

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 - \bullet We know how difficult and how discriminatory question q is
 - The probability of answering a particular question in a pro-European way is a function of respondent's latent support and question's difficulty and discrimination
- Hence:
 - We could calculate the expected number of pro-European responses observed if question q is administered to a sample of N indviduals randomly drawn from the population.



In fact, we find ourselves in the opposite situation:

- The number of pro-European responses given to question q is a known quantity (share × sample size)
- Yet, we do not know how difficult and discriminatory question q is
- Nor we know the average latent support of the population

Therefore:

- We write a model (a system of equations) that formalises the relationship between the different known (observed data) and unknown (model parameters) quantities
- We use a Bayesian programme to "solve" our model and find the most likely combination of model parameters that generates the data that we actually observe.

Bayesian IRT addresses different shortcomings of existing approaches.

With regard to single-question indicators, IRT models:

- Can draw from multiple items to better deal with multidimensionality
- Can deal with interruptions in the administration of a specific item

Similarly, compared to the DR algorithm, IRT models:

- Starts from an individual-level model of response
- Accomodate questions with neutral or ordinal answer options

Application to public support for the EU

To apply Bayesian IRT to the estimation of EU support, I identified 121 Eurobarometer questions asked beween 1973 and 2019.

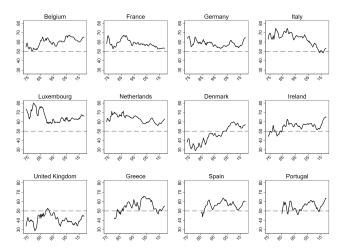
To be included, a question had to be asked at least 4 times and:

- Tap on aspects related to EU trust, attachment, evaluation of EU membership (procedural dimension)
- Or, ask about one of the following: preferences for the level of government responsible for a policy, whether more or less EU action or EU-level harmonisation should take place or whether a common EU policy should be developed in a given domain (substantive dimension)

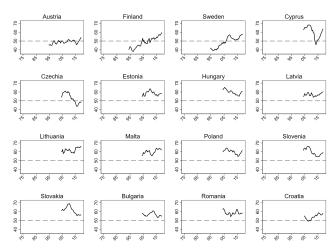
Application to public support for the EU

- Overall, from 591 to 1936 question-semester dyads are available for each EU member state
- The data: share of pro-EU and neutral responses, a question identifier and the fieldwork date for each item administration
- The model is an adaptation of McGann et al. (2019) and it is implementend using the software JAGS.
- Question parameters are constrained to be the same for all countries, so as to ensure cross-country comparability.

Estimated series I



Estimated series II

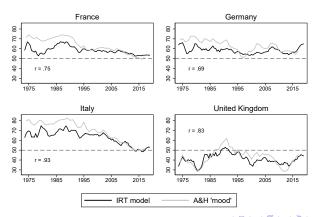


Convergent validity

Is the IRT measure associated with other valid measures of EU support?

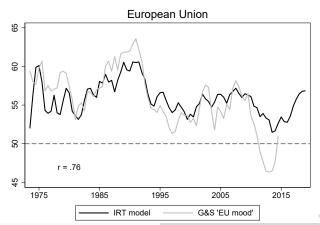
Convergent validity

Comparison with Anderson & Hecht (2018) "preference for Europe" measure estimated with the DR algorithm for four member states.



Convergent validity

Comparison with Guinaudeau & Schnatterer (2019) "EU mood" measure estimated with the DR algorithm for all EU member states.



Model fit

If we accept the IRT estimates to be a good measure of latent public EU support, how well can we predict the true share of positive responses recorded for the 121 items?

| | Root mean sq. error | By-item R-sq |
|-----------------------|---------------------|---------------------|
| IRT model | 3.39 | 0.384 |
| DR algorithm | 3.56 | 0.319 |
| "EU mood" | 3.61 | 0.301 |
| "Membership" question | 3.78 | 0.229 |
| Item means only | 4.31 | 0 (by construction) |

Construct validity

Is the measure associated with other theoretically related concepts?

Namely, is the estimated EU support negatively associated with vote share of Eurosceptic parties?

Construct validity

Tobit regression models of public support for Europe and Eurosceptic vote share.

| | DV: Eurosceptic vote share | | | | |
|---------------------------------|----------------------------|---------|------------|---------|--|
| | Model 1 | | Model 2 | | |
| IRT-estimated EU support | -1.239*** | (0.185) | -0.670** | (0.000) | |
| Previous Eurosceptic vote share | -1.239 | (0.183) | 0.286* | (0.239) | |
| • | | | | (0.111) | |
| Election type (1=European) | | | 2.731 | (1.523) | |
| % exclusive national identity | | | -0.116 | (0.146) | |
| % foreign-born population | | | -0.896 | (0.904) | |
| % foreign-born labour force | | | -0.0865 | (0.877) | |
| Net contribution to EU budget | | | -0.350 | (0.461) | |
| Annual GDP growth rate | | | 0.214 | (0.183) | |
| Annual unemployment rate | | | 0.0609 | (0.262) | |
| Year | | | 0.877*** | (0.247) | |
| Constant | 66.33*** | (10.12) | -1708.9*** | (493.5) | |
| Observations | 259 | | 259 | | |
| Country fixed effects | | | Yes | | |
| $LR \chi^2$ | 48.82 | | 255.14 | | |
| Prob. $> \chi^2$ | 0.000 | | 0.000 | | |
| Log-likelihood | -507.552 | | -404.389 | | |

Robust standard errors in parentheses. * p < 0.05, *** p < 0.01, *** p < 0.001.



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- They are grounded in an individual-level model of response

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Bayesian IRT can produce valid measures of EU support from population-level data:

- IRT models provide a more precise measurement of latent support if compared to available alternative techinques
- They are grounded in an individual-level model of response
- They allow for a sounder treatment of neutral responses

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IRT models can be used to estimate EU support also where comparable measures do not exist:

 Selecting a subset of questions related to a specific policy area, it is possible to estimate public support for EU integration in that domain.

References I

- Anderson, C. J. & Hecht, J. D. (2018), 'The preference for Europe: Public opinion about European integration since 1952', *European Union Politics* **19**(4), 617–638.
- De Vries, C. E. (2018), Euroscepticism and the future of European integration, Oxford University Press, Oxford.
- Guinaudeau, I. & Schnatterer, T. (2019), 'Measuring public support for European integration across time and countries: The 'European Mood' Indicator', *British Journal of Political Science* **49**(03), 1187–1197.
- Hagemann, S., Hobolt, S. B. & Wratil, C. (2017), 'Government Responsiveness in the European Union: Evidence From Council Voting', *Comparative Political Studies* **50**(6), 850–876.
- Hooghe, L. & Marks, G. (2009), 'A postfunctionalist theory of European integration: From permissive consensus to constraining dissensus', *British Journal of Political Science* **39**(1), 1–23.

References II

- Hutter, S. & Grande, E. (2014), 'Politicizing Europe in the national electoral arena: A comparative analysis of five west European Countries, 1970-2010', *Journal of Common Market Studies* **52**(5), 1002–1018.
- McGann, A., Dellepiane-Avellaneda, S. & Bartle, J. (2019), 'Parallel lines? Policy mood in a plurinational democracy', *Electoral Studies* **58**, 48–57.
- Rauh, C., Bes, B. J. & Schoonvelde, M. (2020), 'Undermining, defusing, or defending European integration? Assessing public communication of European executives in times of EU politicization', European Journal of Political Research 59(2), 397–423.
- Reh, C., Bressanelli, E. & Koop, C. (2020), 'Responsive withdrawal? The politics of EU agenda-setting setting', *Journal of European Public Policy* **27**(3), 419–438.

References III

- Stimson, J. A. (1991), *Public opinion in America: moods, cycles, and swings*, Westview Press, Boulder.
- Wratil, C. (2018), 'Modes of government responsiveness in the European Union: Evidence from Council negotiation positions', *European Union Politics* **19**(1), 52–74.
- Wratil, C. (2019), 'Territorial representation and the opinion–policy linkage: evidence from the european union', *American Journal of Political Science* **63**(1), 197–211.

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Thank you!

Thank you all for your comments!