

Modeling Dynamic Comparative Public Opinion

















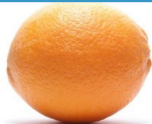
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Modeling Dynamic Comparative Public Opinion

#SPSA2020
San Juan

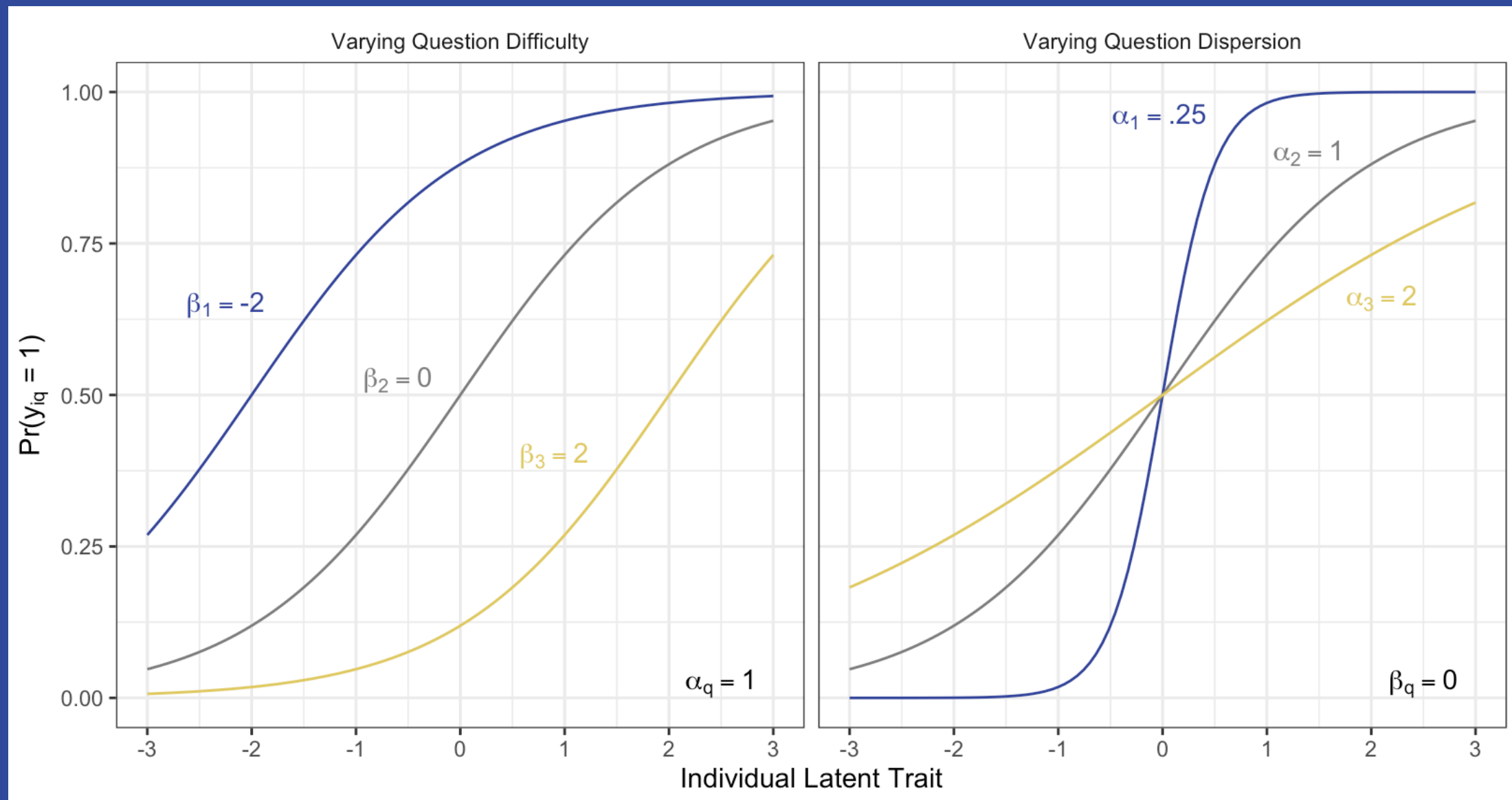
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How to handle sparse, incomparable cross-national time series?

	1991	1992	1993	1994
Australia				
Austria				
Belgium				
Canada				
Denmark				
Finland				
France				
Germany				
Hungary				



Two-Parameter Ordered Logistic Item Response Theory





Country-specific
item bias terms
to address item
response bias

A yellow curved arrow originates from the text 'item bias terms' and points towards the δ_{kq} term in the equation below.

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



Random walk
priors for
opinion mean
and
standard
deviation

$$\bar{\theta}'_{kt} \sim N(\bar{\theta}'_{k,t-1}, \sigma_{\bar{\theta}'}^2)$$


$$\sigma_{kt} \sim \text{LN}(\sigma_{k,t-1}, \sigma_{\sigma}^2)$$



Measure of mean
public opinion

bounded

between 0 and 1


$$\bar{\theta}_{kt} = \text{logit}^{-1}(\bar{\theta}'_{kt} - 1)$$

McGann
(2014)

Claassen
(2019)

Caughey,
O'Grady, and
Warshaw (2019)



Cross-
National

✗

YES

YES

YES

Dynamic
Priors

✗

YES

YES

YES

Ordinal

✗

✗

YES

YES

δ_{kq}

✗

YES

✗

YES

Bounded
Mean Opinion

YES

✗

✗

YES

Opinion
Polarization

YES

✗

✗

YES



Support for Democracy (Claassen 2019)



Support for
Democracy
(Claassen 2019)

51 Survey Datasets



Support for
Democracy
(Claassen 2019)

51 Survey Datasets
107 Countries



Support for Democracy (Claassen 2019)

51 Survey Datasets

107 Countries ← with data
in 3+ years



Support for Democracy (Claassen 2019)

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998 Country-Years



Support for Democracy (Claassen 2019)

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107 Countries ← with data
in 3+ years

out of possible
 $107 * 24 = 2568$ → **998** Country-Years
Sparse!



Support for Democracy (Claassen 2019)

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29 Survey Items



Support for Democracy (Claassen 2019)

51 Survey Datasets

107 Countries ← with data
in 3+ years

out of possible
 $107 * 24 = 2568$ → **998** Country-Years
Sparse!

Incomparable! → **29** Survey Items



Internal Validation Test

Model

Country
Means
MAE

Claassen (2019)

0.112

Caughey, O'Grady,
and Warshaw (2019)

0.186



0.186

Internal Validation Test

Model	Country Means MAE	Model MAE
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Claassen (2019)

0.112

0.032

Caughey, O'Grady,
and Warshaw (2019)

0.186

0.049



0.186

0.031

Internal Validation Test

Model	Country Means MAE	Model MAE	Percentage Improvement
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Claassen (2019)

0.1112

0.032

71.4

Caughey, O'Grady,
and Warshaw (2019)

0.186

0.049

73.7



0.186

0.031

83.3

External Validation Test

Model	<i>k</i> -fold Mean MAE	<i>k</i> -fold Mean Percentage Improvement	<i>k</i> -fold 80% Credible Interval Coverage
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Claassen (2019)

0.057

51.7

+4.9

Caughey, O'Grady,
and Warshaw (2019)

0.063

66.1

-67.4



0.055

70.5

-4.5

Data Preparation

Data Preparation

1 Identify survey items

Data Preparation

- 1** Identify survey items
- 2** Download surveys

Data Preparation

- 1** Identify survey items
- 2** Download surveys
- 3** Generate raw dataset

Data Preparation

- 1 Identify survey items
- 2 Download surveys
- 3 Generate raw dataset
- 4 Reformat dataset for model



Data Preparation

- 1 Identify survey items
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- 3 Generate raw dataset
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Data Preparation

- 1 Identify survey items
- 2 Download surveys ← Automated!
(well, mostly)
- 3 Generate raw dataset
- 4 Reformat dataset for model



Data Preparation

- 1 Identify survey items
- 2 Download surveys ← Automated!
(well, mostly)
- 3 Generate raw dataset ← Automated!
614 surveys
in DCPOtools
- 4 Reformat dataset for model



Data Preparation

- 1 Identify survey items
- 2 Download surveys ← Automated!
(well, mostly)
- 3 Generate raw dataset ← Automated!
614 surveys
in DCPOtools
- 4 Reformat dataset for model
← Totally
automated!



Dynamic
Comparative
Public
Opinion

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Dynamic
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The **DCPO** package is available **now on CRAN**:
<https://CRAN.R-project.org/package=DCPO>

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Dynamic Comparative Public Opinion

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Get the **paper here**:



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