

# Political Economy Conditions for Carbon Pricing

Explaining cross-national variation in carbon pricing

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**Wednesday 28<sup>th</sup> of November – Section C**

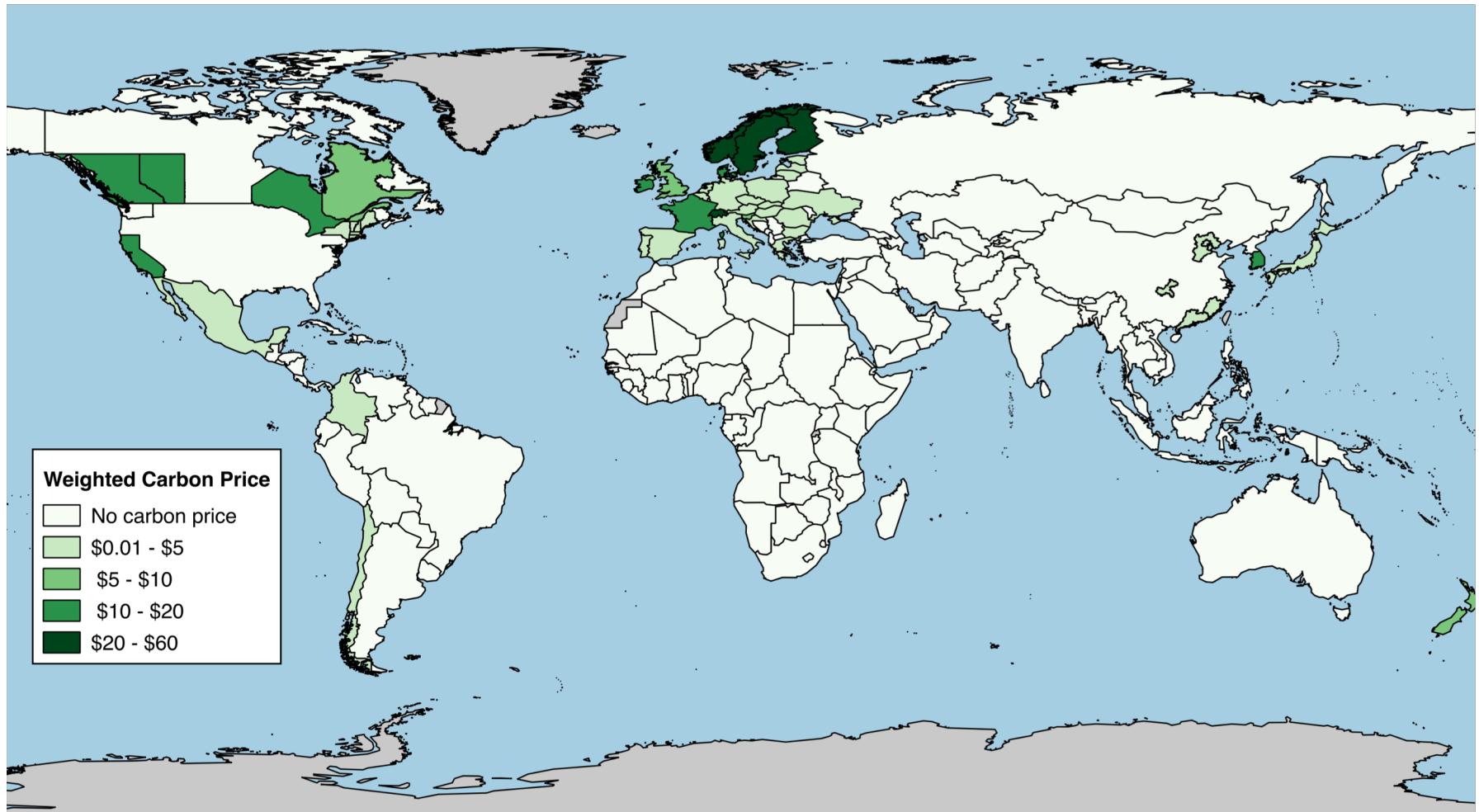
# Overview

## 1 – Carbon Prices Worldwide

## 2 – Methods

## 3 – Regression Analysis Empirical Result and Theoretical Links

# CO<sub>2</sub> prices are deployed in all regions of the world, except Africa. Prices are highest in the Global North



Data / Literature: World Bank Carbon Pricing Dashboard. Data as of 1<sup>st</sup> April 2017.

# Overview





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To estimate the effect of political economy conditions on CO<sub>2</sub> prices we calculate a cross-national Tobit model on 192 observations

169  countries<sup>1</sup> + 23 subnational units   

missing values are imputed<sup>2</sup>

# cross-sectional Tobit model

1) Includes only UN recognized nation states with a population over 500'000 (minus Rwanda and Western Sahara which have been excluded due to missing data issues) and all Chinese, Canadian, and US-American states/provinces that have a carbon price. 2) We also estimate a model using case-wise deletion as a robustness test

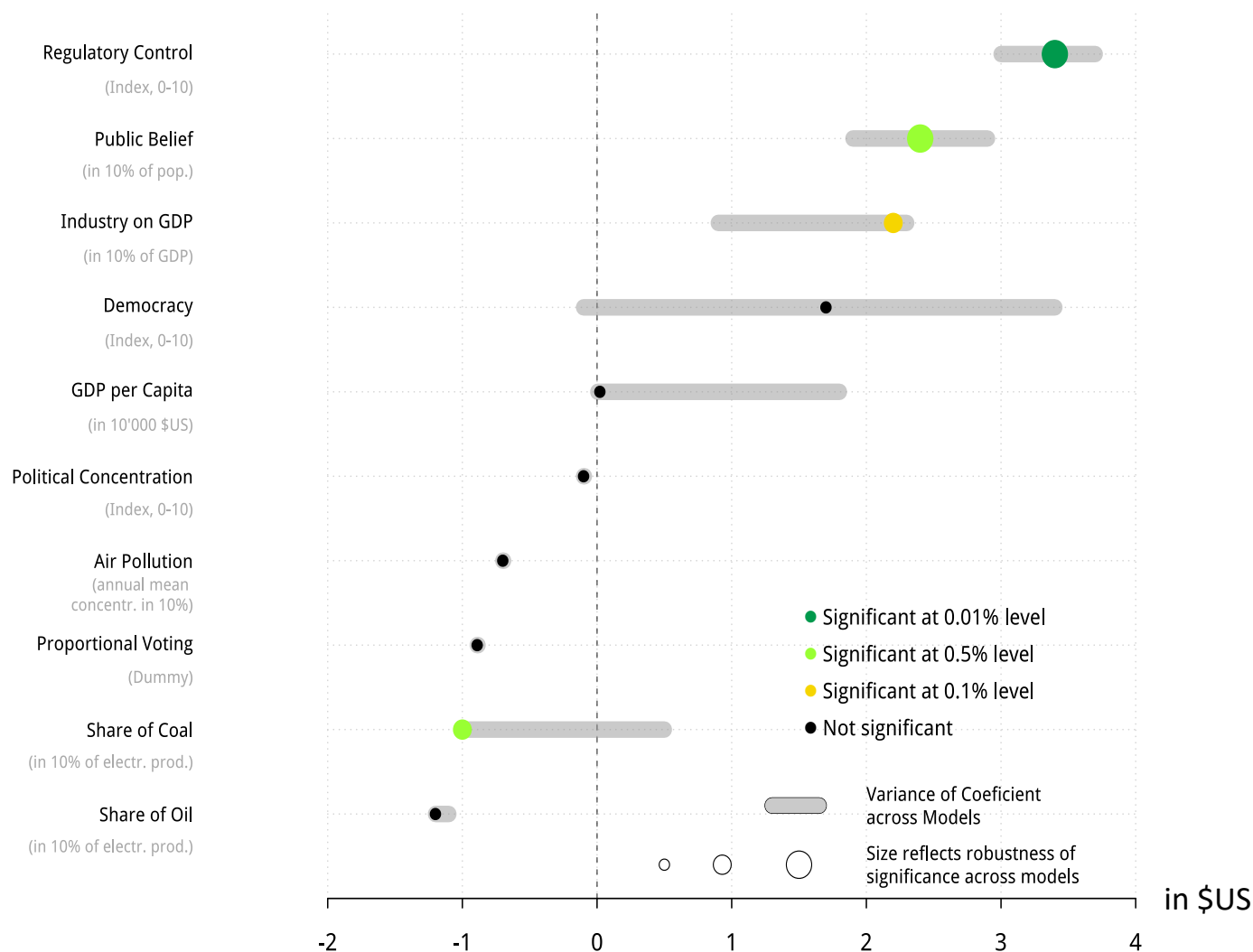
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Empirical Result and Theoretical Links

# Carbon Prices depend positively on good governance and public attitude and negatively on the burning of fossil fuels



The strongest predictor is Good Governance – a ten percent increase corresponds with a rise of \$3.30 per tCO<sub>2</sub>



Regulatory  
Capacity

Absence of  
Corruption

Public  
Trust

Literature: Karapin (2016); Joas & Flachslan (2016); Rafaty (2018); Carattini, Baranzini & Roca (2015)

The second-important factor is public belief in human-made climate change. Prices increase by \$2.40 per 10% of pop. believing



Absence of  
Information

Lack of  
Attention

Active  
Denial

Literature: Bord, Connor & Fischer (2000); Carlsson et al. (2012); Tjernström & Tietenberg (2008)

Fossil Fuel Usage is negatively associated with carbon prices. Prices decrease by \$1 for each 10% of electricity produced by coal or oil



Economic  
Costs

Political  
Costs

Regulatory  
Capture

Literature: Lapachelle & Peterson (2013); Dolphin, Pollitt & Newberry (2016); Biber, Kelsey & Meckling (2017)

# Take-Home Messages

1

Carbon prices are diverse but often very **low**.

2

**Good Governance and Public Attitude**  
are the most important determinants of CO2 prices.

3

**Fossil fuel firing** does negatively affect carbon prices  
– however, influence is lower compared to political  
factors.

# Annex

Annex



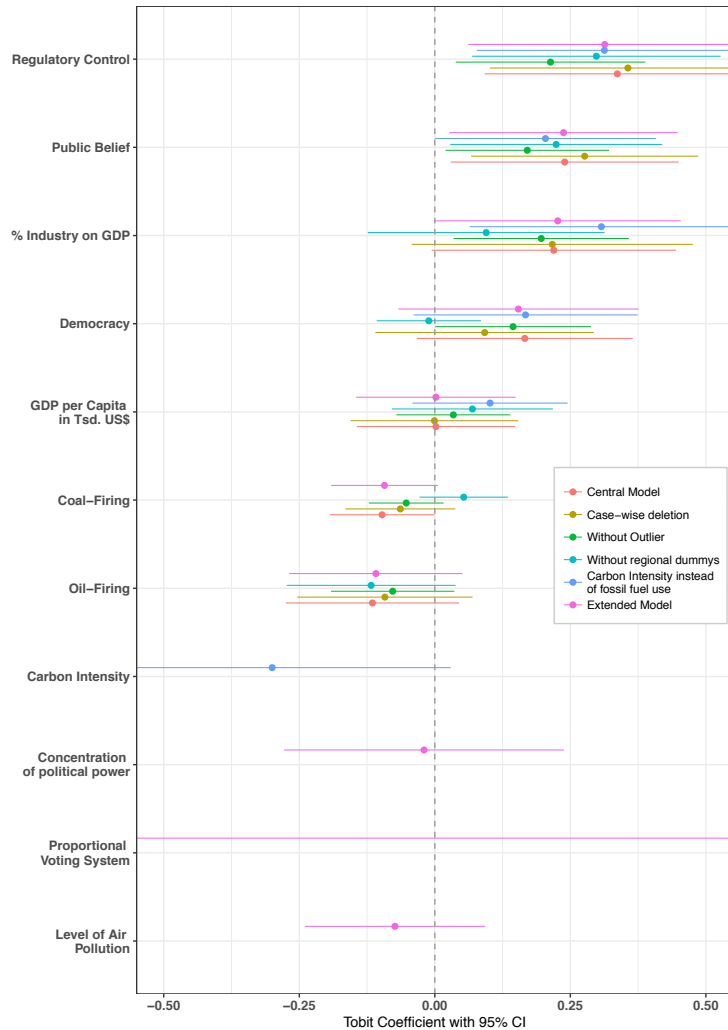
# Data Sources

Variable	Data Source
Weighted Carbon Price	World Bank
GDP per Capita	World Bank; U.S. Bureau of Economic Analysis ; Statcan; National Bureau of Statistics of China
Democracy	Polity IV Index, Center for Systemic Peace
Regulatory Control	World Governance Indicators, World Bank
Government Effectiveness	World Governance Indicators, World Bank
Corruption Control	World Governance Indicators, World Bank
Public Belief in Human-Made Climate Change	Gallup Research Yale University
Industry on GDP	World Bank; US Bureau of Economic Administration; CANSim, National Bureau of Statistics of China
Oil Usage	World Bank
Coal Usage	U.S. Energy Information Administration ,Canadian state energy agencies Guangdong civic exchange report; U.S. EPA
Carbon Intensity	World Bank; U.S. EIA; Environment and Climate Change Canada; Deng (2015)
Air Pollution PM2.5	World Health Organization
Political Concentration	Witold J. Henisz
Proportional Voting System	Parline Database

# Main results stay robust across different model specifications

Tobit Regression Model on weighted carbon price in \$US							
Variable	1	2	3	4	5	6	7
GDP per capita (in Thsd. \$US)	0 ( 0.07 )	0.07 ( 0.08 )	0 ( 0.07 )	0 ( 0.07 )		0.19 *** ( 0.05 )	0.05 ( 0.07 )
Public Belief (in % of population)	0.24 ** ( 0.11 )	0.22 ** ( 0.1 )	0.24 ** ( 0.11 )	0.24 ** ( 0.11 )	0.3 *** ( 0.1 )		0.19 * ( 0.1 )
Air Pollution (in %)				-0.07 ( 0.08 )			
Coal Use (in % of elec. Prod)	-0.1 ** ( 0.05 )	0.05 ( 0.04 )	-0.1 * ( 0.05 )	-0.09 * ( 0.05 )	-0.09 * ( 0.05 )	-0.06 ( 0.05 )	
Oil Use (in % of elec. Prod)	-0.12 ( 0.08 )	-0.12 ( 0.08 )	-0.11 ( 0.08 )	-0.11 ( 0.08 )	-0.12 ( 0.08 )	-0.11 ( 0.07 )	
Industry on GDP (in % of GDP)	0.22 * ( 0.11 )	0.09 ( 0.11 )	0.22 * ( 0.12 )	0.23 * ( 0.12 )	0.13 ( 0.11 )	0.22 * ( 0.12 )	
Carbon Intensity (in ton per capita)							-0.18 ( 0.16 )
Democracy (Scale 1-100)	0.17 ( 0.1 )	-0.01 ( 0.05 )	0.17 ( 0.11 )	0.15 ( 0.11 )		0.33 *** ( 0.12 )	0.11 ( 0.11 )
Proportional Voting System (Dummy)			-0.89 ( 2.52 )				
Concentration of political power (Scale 1-100)			-0.02 ( 0.13 )				
Regulatory Control (Scale 1-100)	0.34 *** ( 0.12 )	0.3 ** ( 0.12 )	0.33 ** ( 0.13 )	0.32 ** ( 0.13 )	0.37 *** ( 0.08 )		0.34 *** ( 0.12 )
Part of EU ETS	9.32 *** ( 2.15 )		9.88 *** ( 2.63 )	9.38 *** ( 2.15 )	10.64 *** ( 2.09 )	9.49 *** ( 2.15 )	8.89 *** ( 2.21 )
Part of Chinese Pilot ETS	34.79 *** ( 8.76 )		34.27 *** ( 8.77 )	38.66 *** ( 10.02 )	24.73 *** ( 5.19 )	36.59 *** ( 10.34 )	28.04 *** ( 9.04 )
No. of observations	192	192	192	192	192	192	192
Log Likelihood	-470.64	-495.16	-470.46	-470.2	-472.5	-478.66	-474.81
*** - p<0.01, ** - p<0.05, * - p<0.1							

# Main results are also robust to outliers and to different strategies in dealing with missing observations



# Main results stay robust even when a generalized Tobit model instead of a standard Tobit model is calculated<sup>1</sup>

Coefficients (location model):

	<b>Estimate</b>	<b>Std. Error</b>	<b>z value</b>	<b>Pr(&gt; z )</b>
(Intercept)	-276.1922	183.5913	-1.504	0.132482
<b>GDP.per.capita.USD.2015</b>	-1.2227	0.5347	-2.287	0.022209 *
<b>Democracy</b>	1.2726	1.5297	0.832	0.405459
<b>Regulatory.Control</b>	3.8147	0.7831	4.871	1.11e-06 ***
<b>HUMANTOTALC</b>	1.4742	0.8162	1.806	0.070898 .
<b>Industry.on.GDP.2015</b>	-6.8204	1.1228	-6.075	1.24e-09 ***
<b>Share.Electricity.Oil</b>	-1.8565	0.2312	-8.030	9.73e-16 ***
<b>Share.Electricity.Coal</b>	-0.2281	0.1871	-1.220	0.222615
<b>EU1</b>	214.0314	15.1639	14.114	< 2e-16 ***
<b>China1</b>	483.8246	143.8641	3.363	0.000771 ***

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Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

Distribution: student

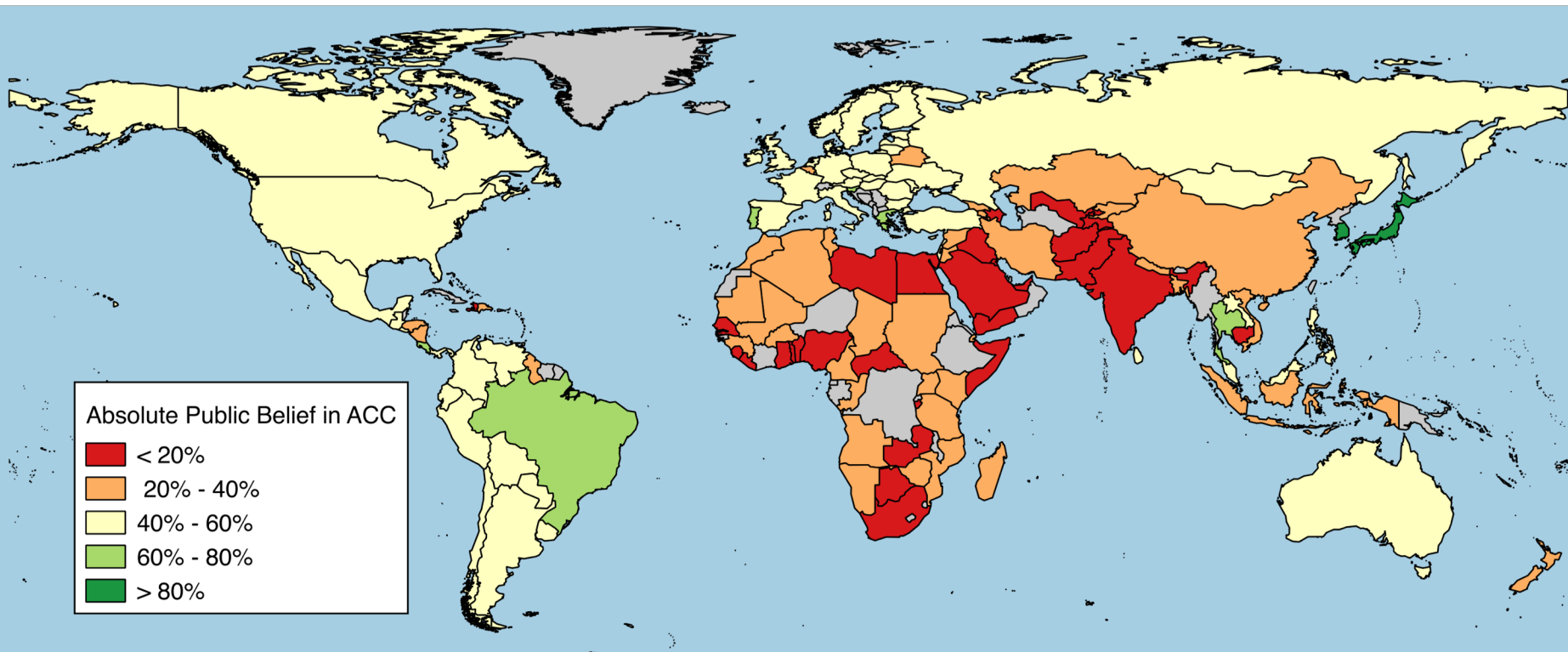
Df: 0.4898

Log-likelihood: -400.2 on 12 Df

Number of iterations in BFGS optimization: 2036

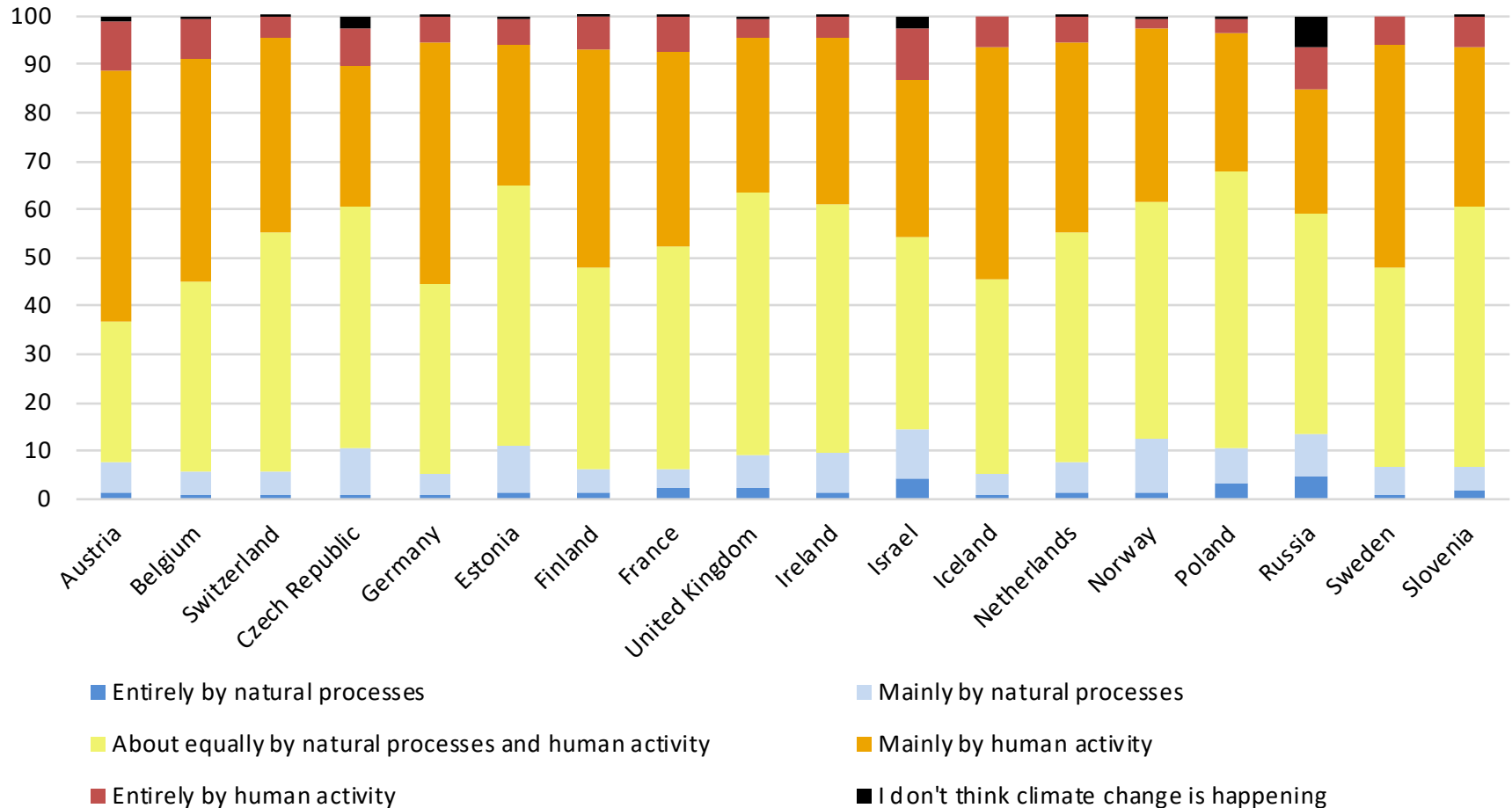
1) Preliminary Model Estimate – Please do not cite or circulate.

# Public Belief in Human-Climate Change varies from 7% in Liberia to 86% in Japan



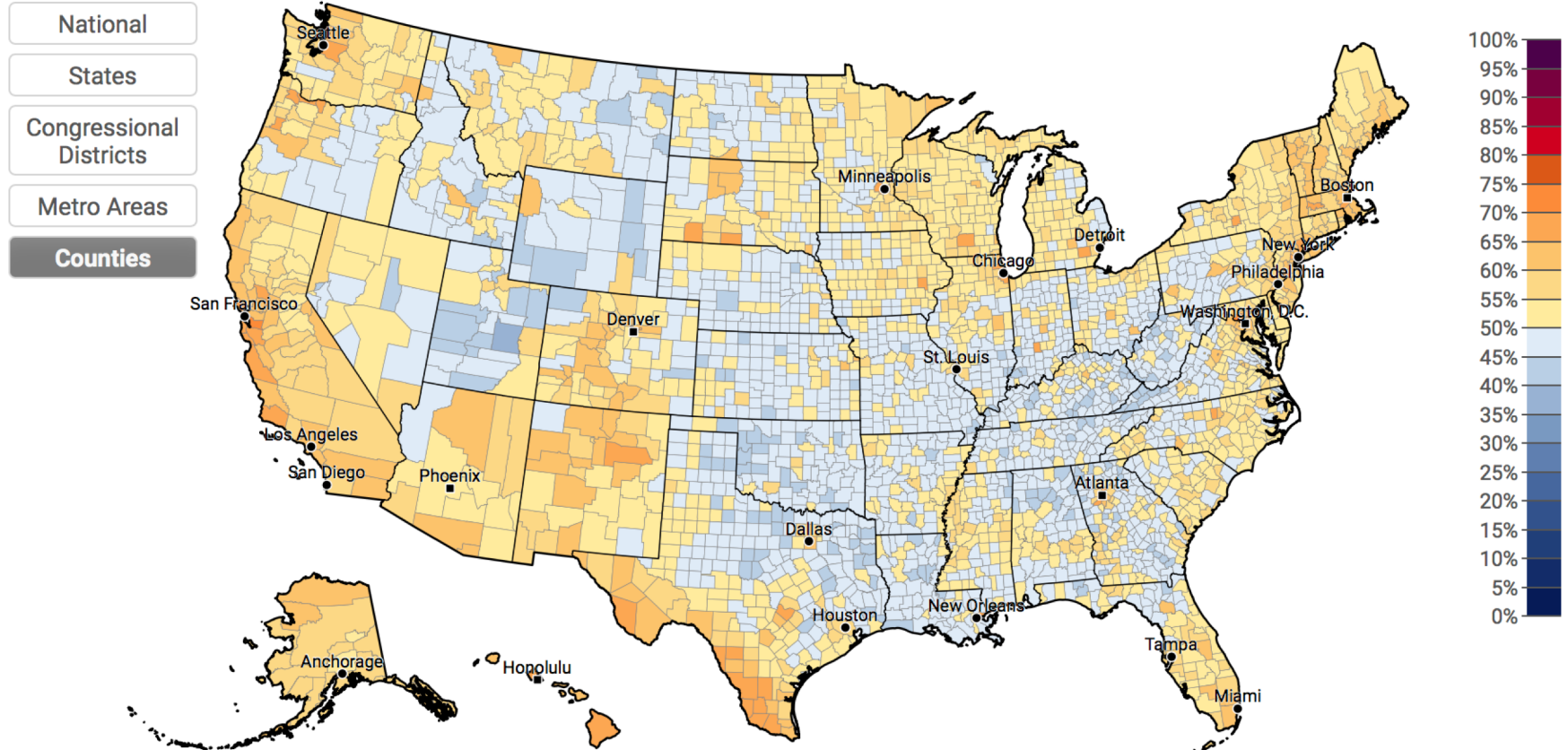
Data / Literature: Gallup Research 2008/09 and 2010/11

# Also in Europe, less than 50% of the population believe that climate change is mainly caused by human activity...



Data / Literature: European Social Survey 8 (2016) - Row Percentages: Climate change caused by natural processes, human activity, or both

...just like in the USA



Data / Literature: Yale Climate Communication – 2018 Data: Estimated % of adults who think global warming is mostly caused by human activities

# Literature and Data Sources

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