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C E M S

Big Data in Management Research AOM – Research Workshop

Jakob Müllner

2025/07

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EIBA SUMMER SCHOOL

4th EIBA – Summer School on Research Methods in IB "Artificial Intelligence, Machine Learning, and Big Data: Opportunities and Challenges for International Business Research"

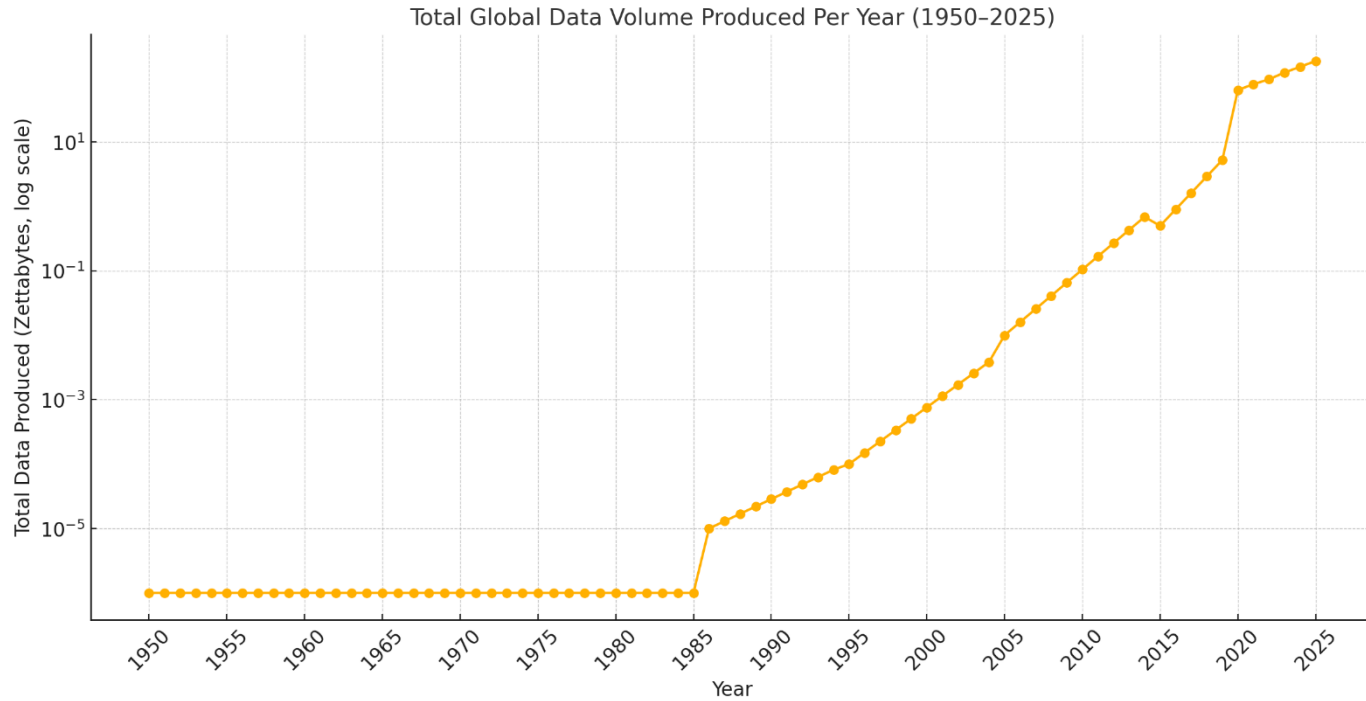
The European International Business Academy (EIBA) in collaboration with the Vienna University of Economics and Business is pleased to announce that the 5th EIBA Summer School will be held at the iconic campus of the Vienna University of Economics and Business, September 1-6 2025.

The 5th EIBA Summer School, titled "Artificial Intelligence, Machine Learning, and Big Data: Opportunities and Challenges for International Business Research", offers a unique opportunity for emerging scholars to engage with the rapidly evolving landscape of international business (IB). As digital multinational corporations (MNCs), platform-based companies, and AI-driven ecosystems redefine global markets, traditional IB frameworks are increasingly challenged. This program aims to explore how these transformations necessitate a rethinking of IB theories, a reorientation of research priorities, and a methodological evolution to capture the novel dynamics shaping international business today.

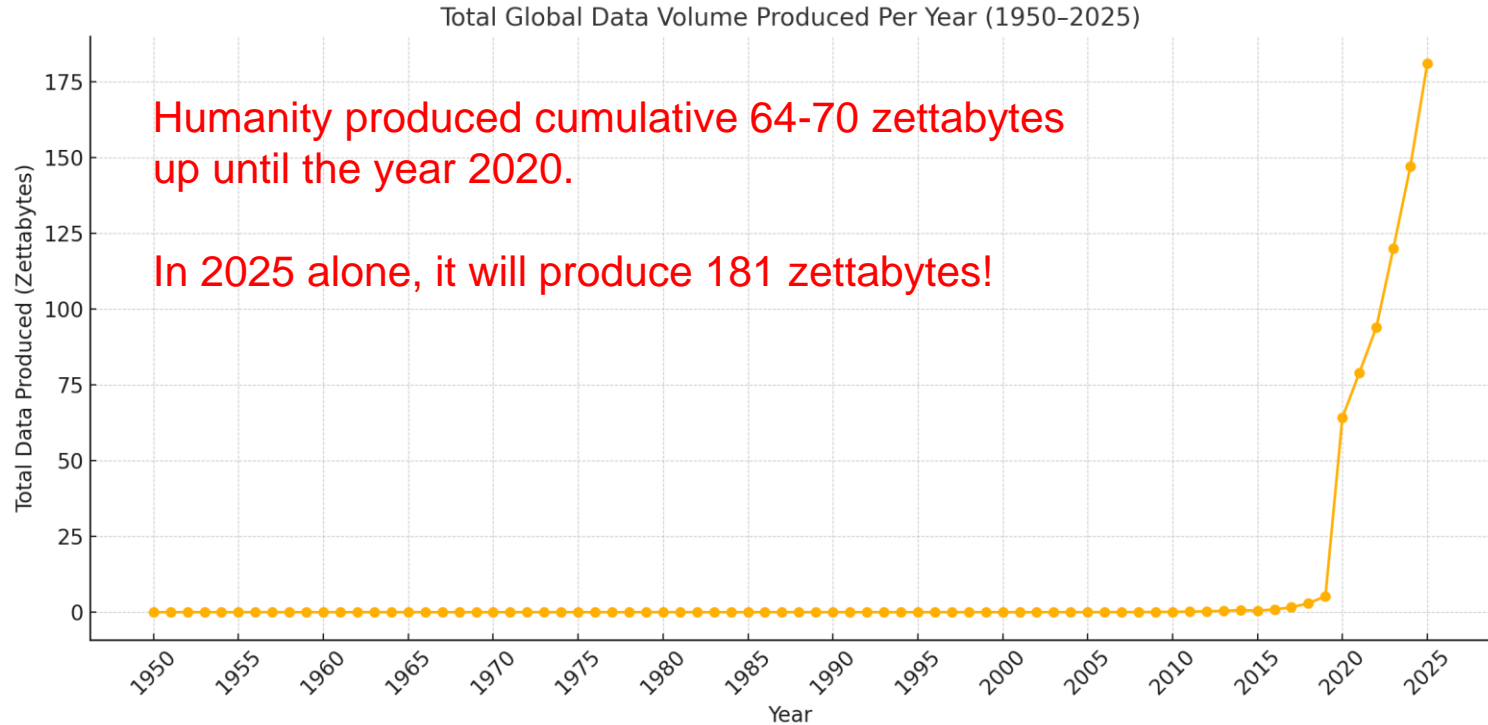
Participants will delve into the ways digitalization and data proliferation reshape IB scholarship. The summer school emphasizes four critical areas: (a) reevaluating foundational IB theories to better reflect the realities of digital MNCs and platform companies, (b) shifting research questions to address emerging issues such as algorithmic governance, digital supply chains, and data sovereignty, (c) leveraging new data sources, including big data and digital trace data, to improve existing measures or uncover previously unobservable phenomena, and (d) adopting cutting-edge empirical methods such as machine learning, network analysis, and natural language processing to analyze these trends effectively.



Big Data



Big Data



Three Examples Big Data Sources



Reach (almost) every person in the world

Our globaltrends software allows users to **download and process large amounts of GoogleTrends** data from more than 5 billion representative users worldwide

Strengths:

- Zero cost of data collection
- Real-time data availability
- Global coverage
- Granular subnational data
- Versatility (can be used for companies, products, persons, trends...)
- Zero response bias as Google is used in daily life



Read (almost) every digital information in the world

GDELT tracks **world's broadcast, print, and web news** in over 100 languages and identifies people, locations, organizations, themes, sources, emotions, counts, quotes, images and events driving our global society every second of every day.

Strengths:

- Multi-language data
- Real-time data availability
- Global coverage
- Includes context, emotions, events and relationships



Access the worlds largest media aggregation site

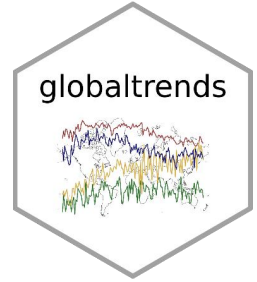
Qualitative data from official sources on **transactions** (e.g. FDI, Trade), **individuals** (e.g. taxes, employment), **firms** (e.g. investment, employment). Fully matched, anonymized and remotely accessible.

Strengths:

- Qualitative depth
- Context
- Open API
- Moderated content

3.1

GOOGLE DATA IN STRATEGY



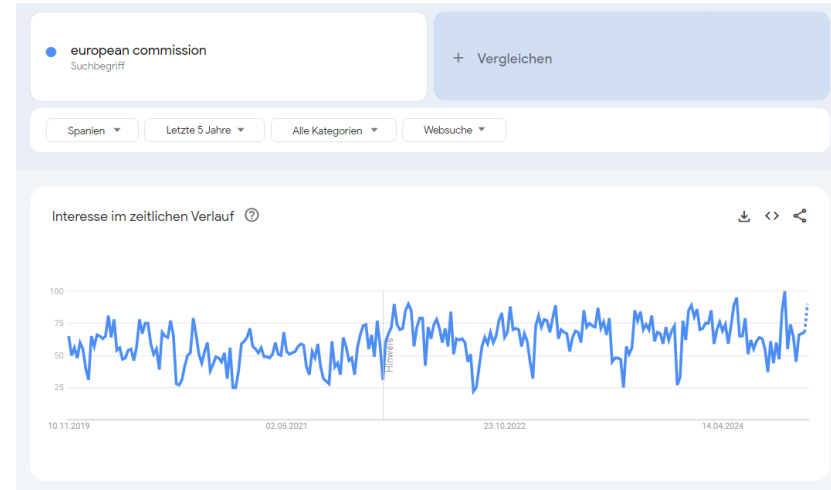
Rich & validated applications of Google Trends

- Public health & epidemiology (symptom tracking, pandemic research)
- Economics (macro-level forecasting)
- Political science (polling, issue salience, public opinion)
- Finance (stockholder recognition, stock price volatility, trading behavior)
- Social science (measuring cultural values like environmental awareness, religiosity, behavior like sexual behavior, or crime)
- Tourism (forecasting travel activity)
- Sports research (player/team performance/value)
- Meteorology & climate research (study extreme weather phenomena)
- Marketing (advertising efficiency, brand value measurement)

Few applications of Google Trends in Management

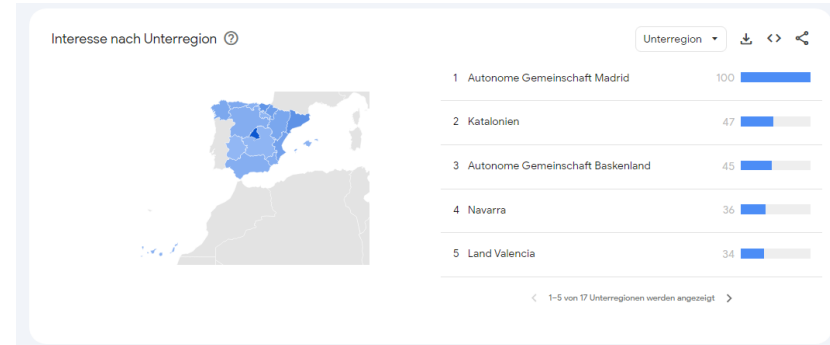
Google Trends

- Google Trends offers a portal to analyze search activities on Google
- The data is available globally or by country or region (e.g., provinces)
- Google provides two types of data:
 - Time series for search interest
 - Related search queries (rising, top)
- Google allows the usage of plain-language terms and automatically generated „topics“
 - Topics help to avoid issues related to the definition of search terms



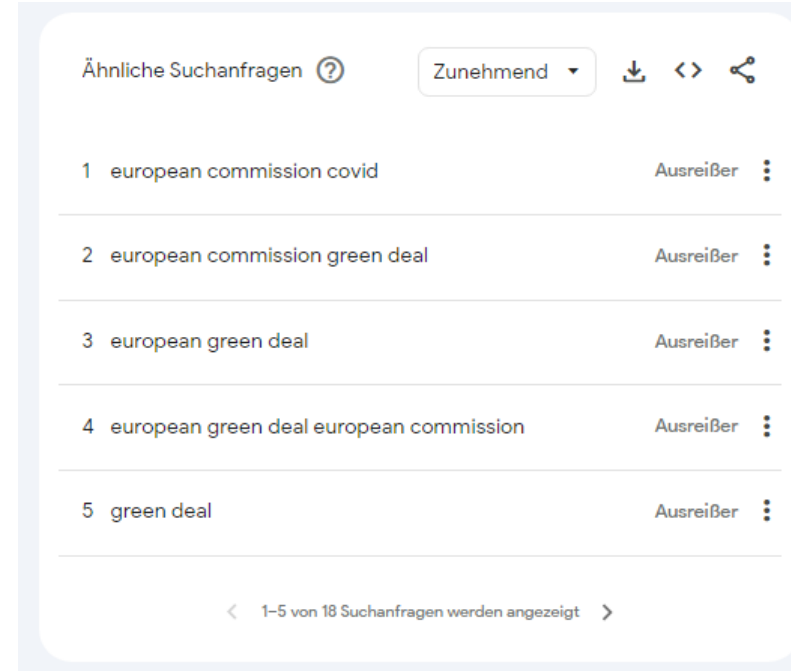
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Foundations for the application of Google Trends in Management & Strategy Science

- Information gathering on Google as part of **individuals' decision-making processes**
 - Search engines are an essential channel by which to access information
 - Greater search volumes for a topic signifying greater public attention
- Google reflects every-day **information seeking behavior** of over 5 bn. internet users
 - No reporting bias
 - Time series data
 - Reliable geo-tagging
 - Global, national, and subnational data

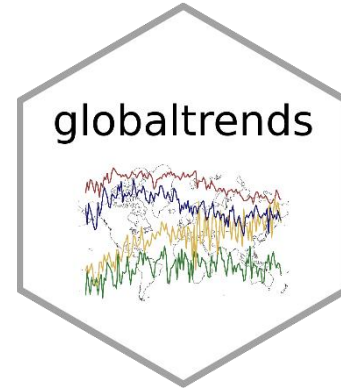
Data on Google searches lends itself to study attitudes, awareness, and internationalization

We have used Google Trends in a number of projects

- [Puhr, H. & Müllner, J. 2024](#). Vox Populi, Vox Dei: A Concept and Measure for Grassroots Socio-Political Risk Using Google Trends. *Journal of International Management*.
- [Puhr, H. & Kupfer, A. 2023](#). Media in the Geopolitical Crossfire: Identification and Novel Data Sources for IB Research. *A / B Insights*, 23(1): 1-6.
- [Puhr, H. & Müllner, J. 2022](#). Foreign to all but fluent in many: The effect of multinationality on shock resilience. *Journal of World Business*, 57(6): 101370.
- [Puhr, H. & Müllner, J. 2021](#). Let me Google that for you: Capturing globalization using Google Trends, , SSRN Working Paper <https://ssrn.com/abstract=3969013> Vienna: University of Innsbruck, Vienna University of Economics and Business.

Our globaltrends R Package

- The `globaltrends` R package provides standardized indices for
- country-level search scores,
 - degree of internationalization (DOI) and
 - volume of internationalization (VOI) for any construct of interest
- Code and extensive documentation available on GitHub ([link](#))
- Conceptual discussion of using Google Trends to measure globalization on SSRN ([link](#))
- We have successfully used `globaltrends` in various empirical applications



What can you use it for?

- Application I: Measuring Degree of Internationalization
- Application II: Measuring Socio-Political Risks
- Application III: Event-Study
- Application IV: Measuring Country Distances
- Application V: Media Analysis
- Application VI: Pattern Analysis

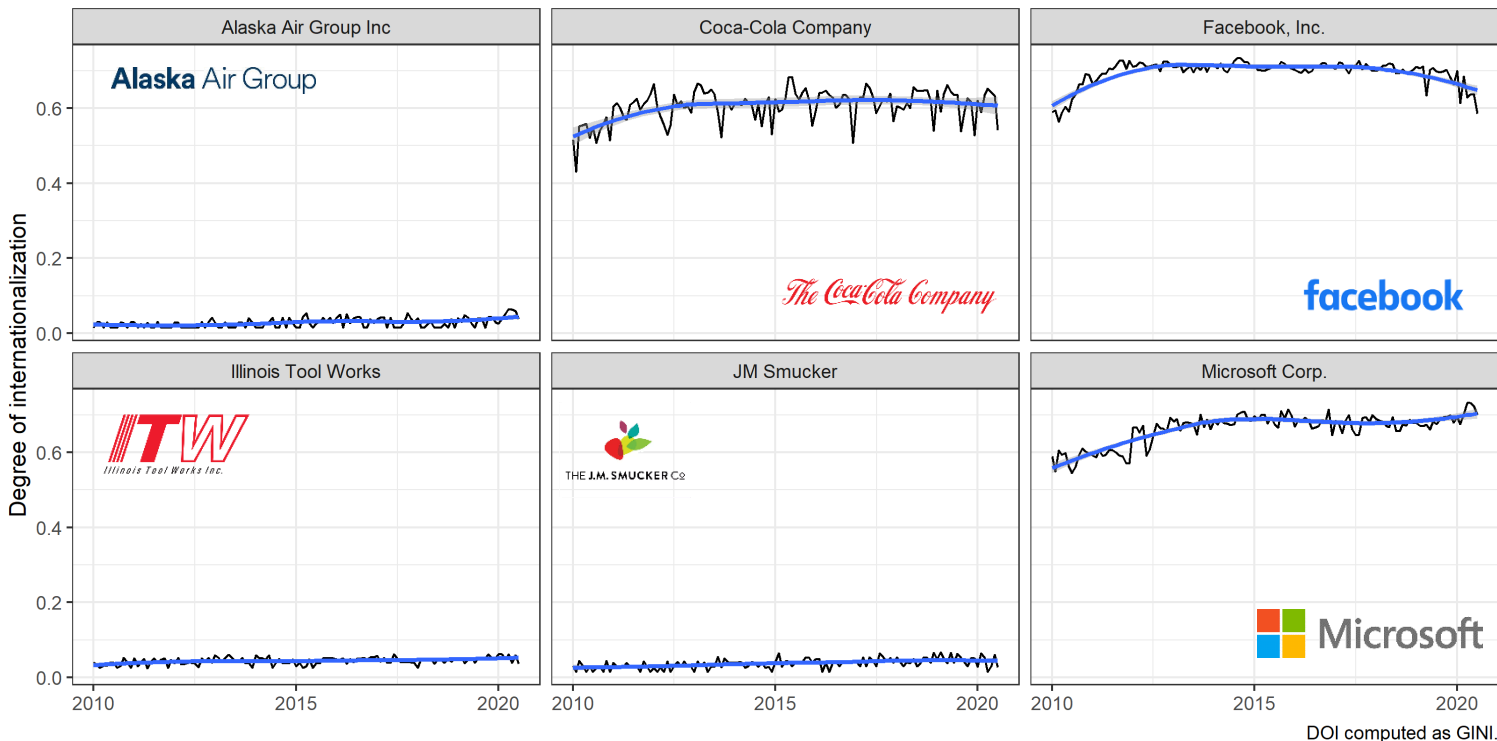
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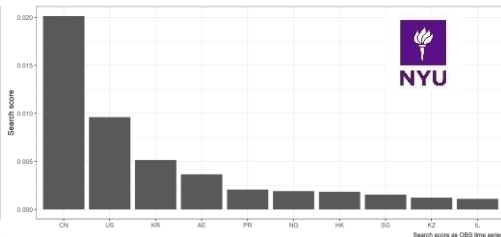
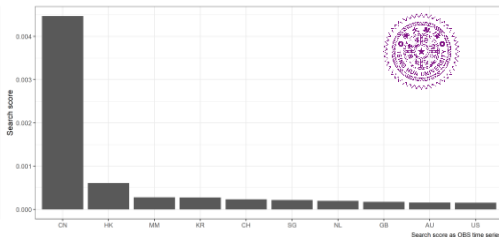
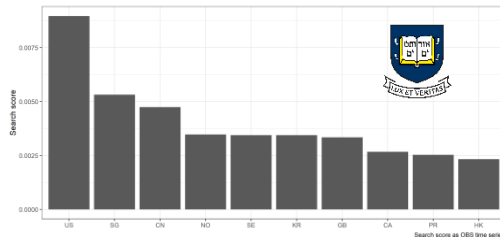
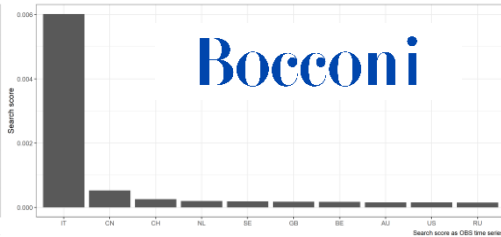
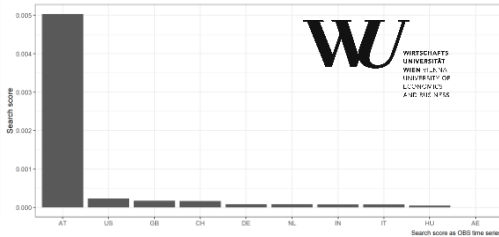
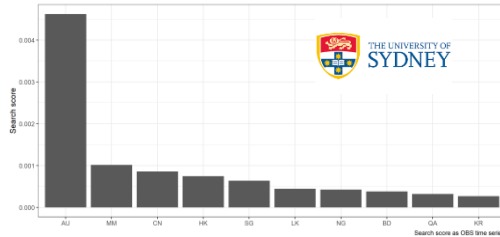
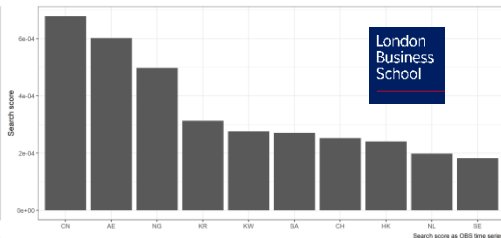
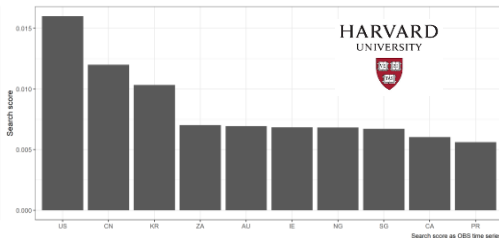
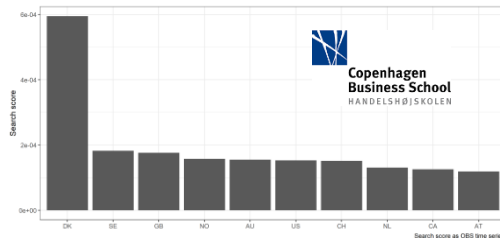
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Degree of Internationalization of S&P 500 Companies

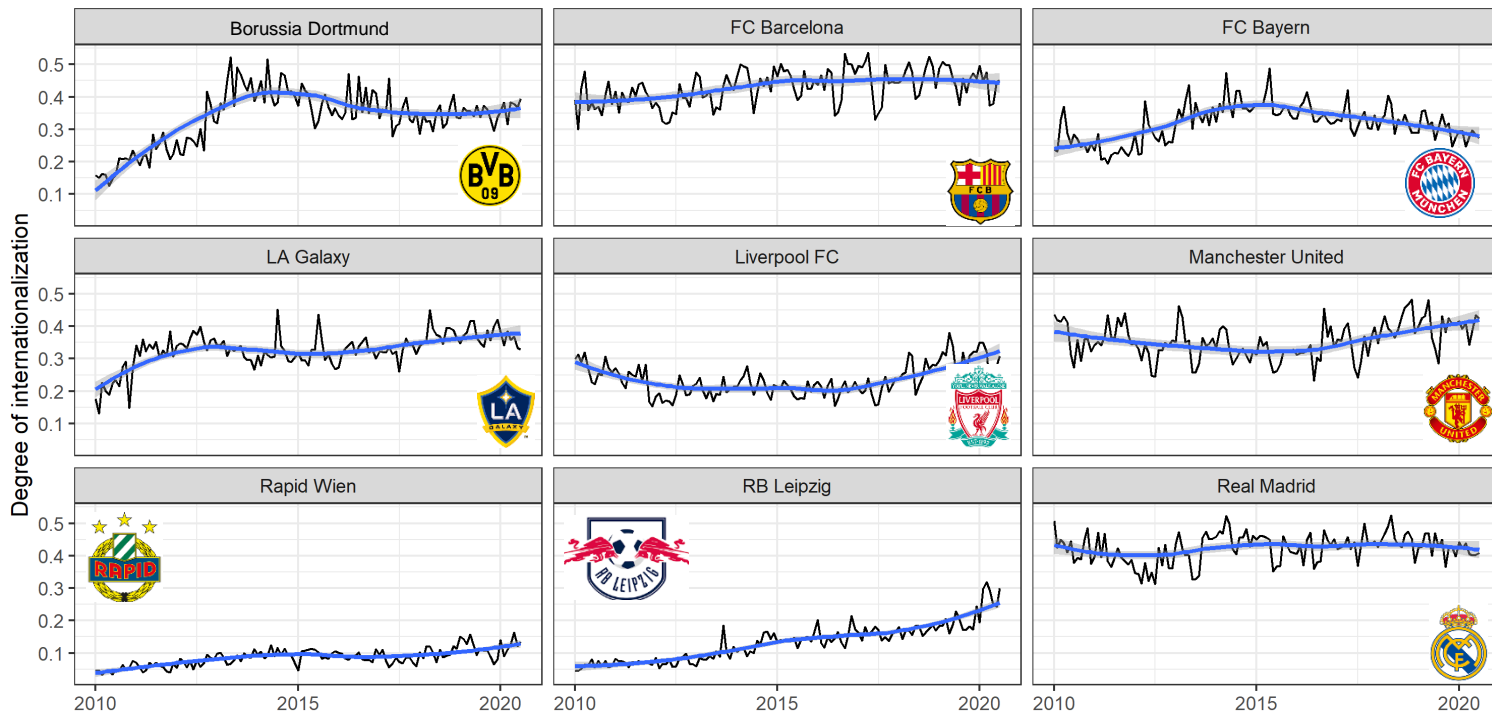


Application I: Measuring Degree of Internationalization

Non-profit Organizations (e.g., Universities)



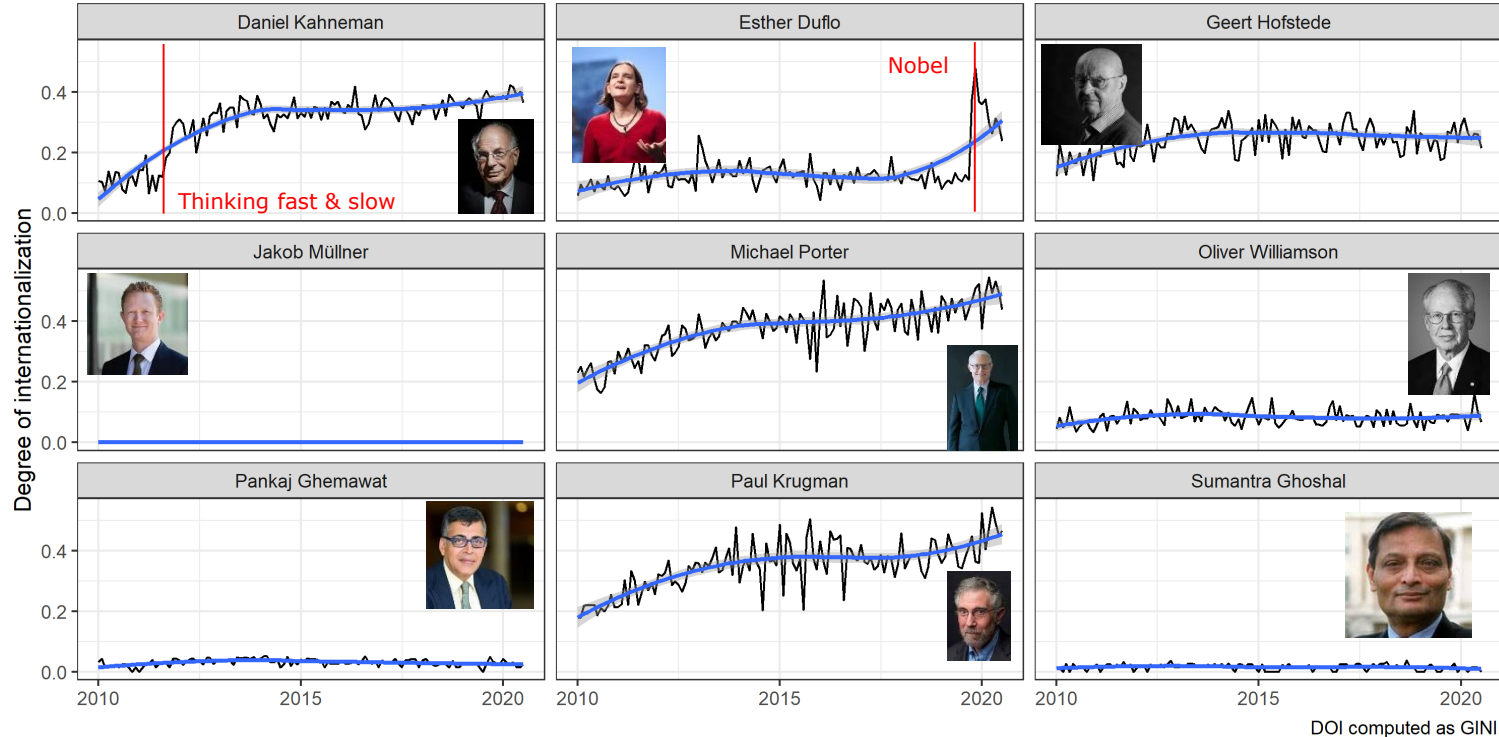
Non-profit Organizations (e.g., Sports clubs)



DOI computed as GINI.

Application I: Measuring Degree of Internationalization

Researchers & Authors



What can you use it for?

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- Application V: Media Analysis
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Pühr, H. & Müllner, J. 2024. Vox Populi, Vox Dei: A Concept and Measure for Grassroots Socio-Political Risk Using Google Trends. *Journal of International Management*.

Our empirical Approach to Measurement

- We build on methodologies by extant text-based (unidimensional) risk indices (Baker et al., 2013, 2016; Bontempi et al., 2021; Donadelli & Gerotto, 2019; Castelnuovo & Tran, 2017)

Approach

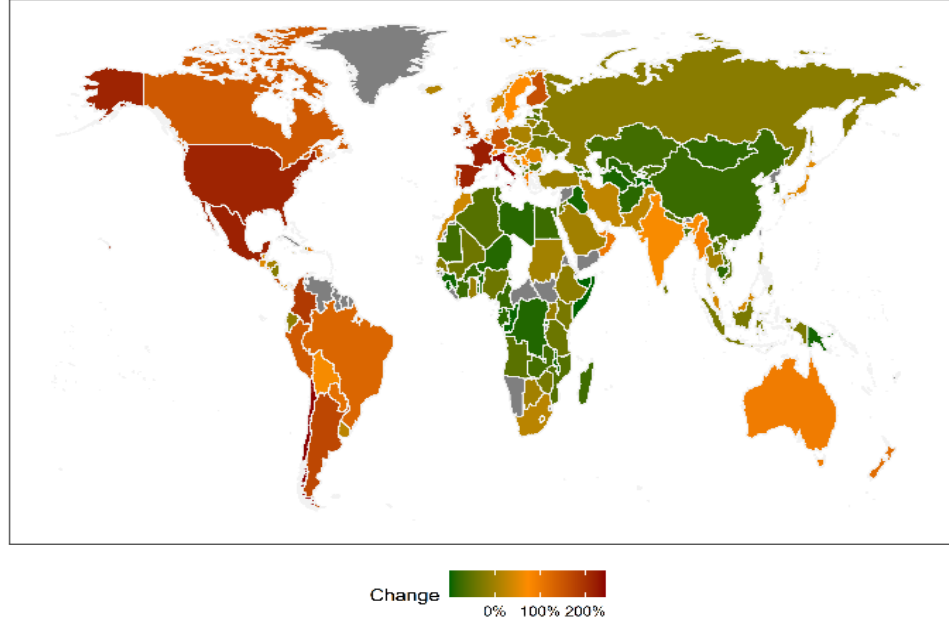
- Category and term identification and selection based on literature review
- Usage of language-independent “search topics” provided by Google
- Download and processing of search volumes using the `globaltrends` package for R
- Aggregation of terms to four categories, country risk, and weighted global risk

Data

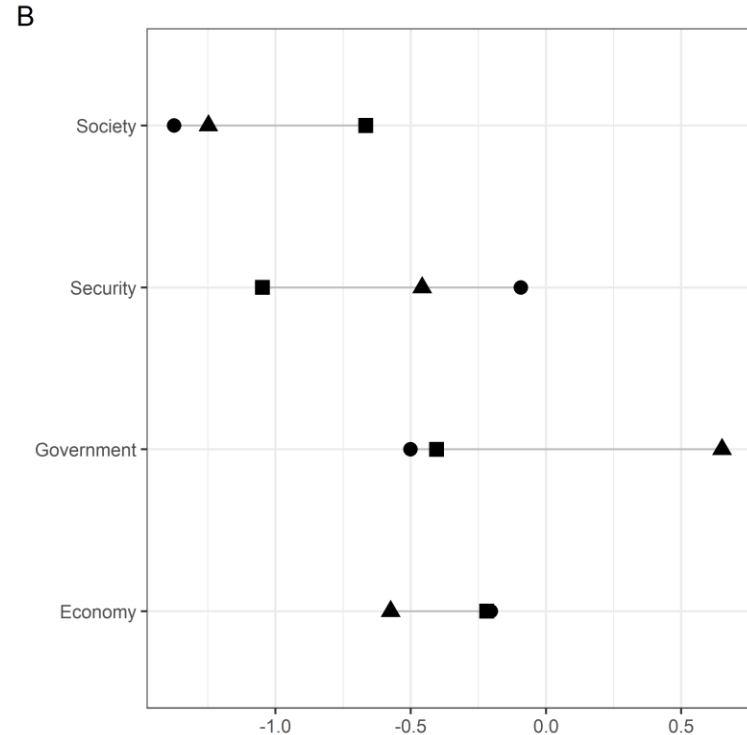
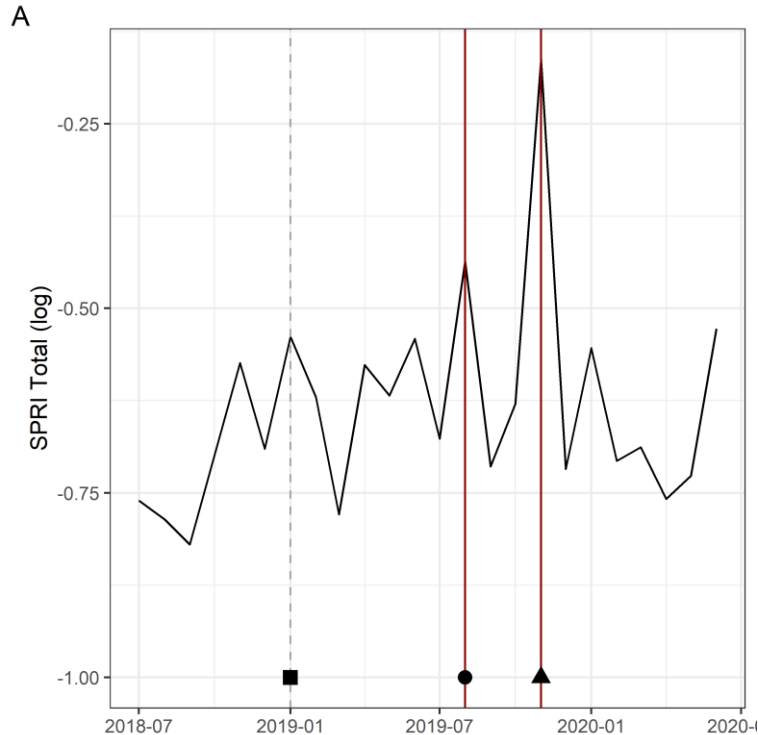
- 4 categories of socio-political risk: Economy, Government, Security, and Social
- 110 keywords relating to these four categories
- Data for 149 countries that represent about 98% of global population and GDP
- Timeseries of monthly data from 2010 to 2020

Country-level socio-political Risk Index

Change in SPRI Total (2010-2020)



Detailed socio-political Risk Analysis (e.g., Hong Kong)



- baseline SPRI (2019-01); ● general strike and HKIA blockade (2019-08);
- ▲ citywide strike and district council elections (2019-11)

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Event Study: Methodology

Focus of interest:

- **Abnormal changes of interest** in a focal firm, person, or construct **within countries**

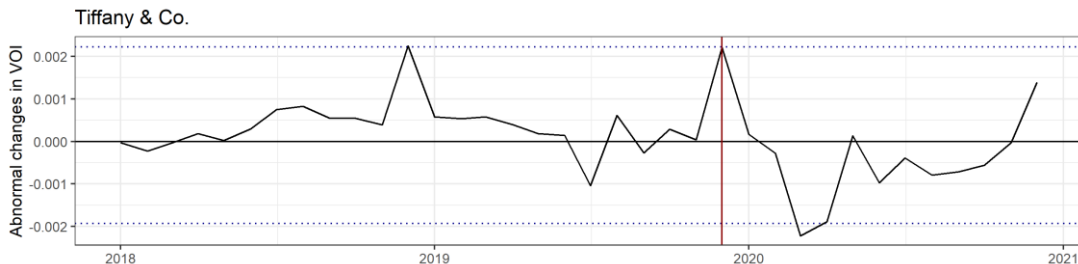
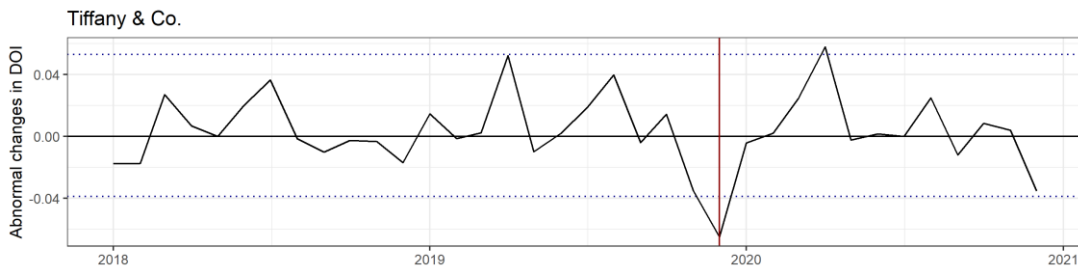
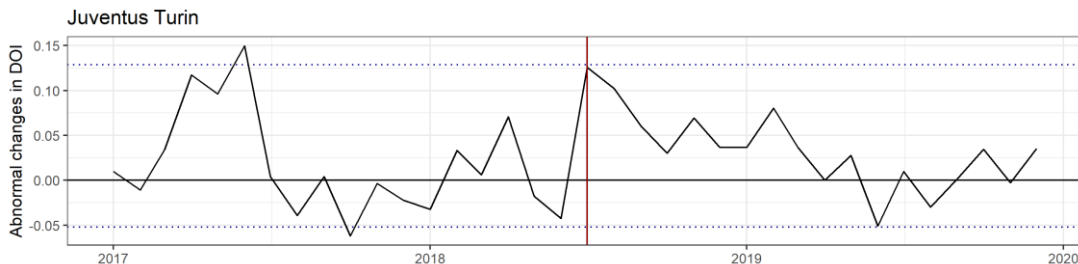
Conceptualization:

- Google Trends provides highly granular data (up to daily data)
- Events (e.g., M&A) trigger changes in search volumes on Google
- Deviation in information seeking from “normal” levels as indicator for effect of event

$$Abnorm. \Delta_t = Google_t - \overline{Google_T}$$

Event Study: Abnormal Changes in DOI

Cristiano
Ronaldo
Transfer



LVMH

Announced
acquisition by
LVMH

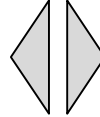
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Information gathering and Distance

Cross-national distance

Impediment to information flows



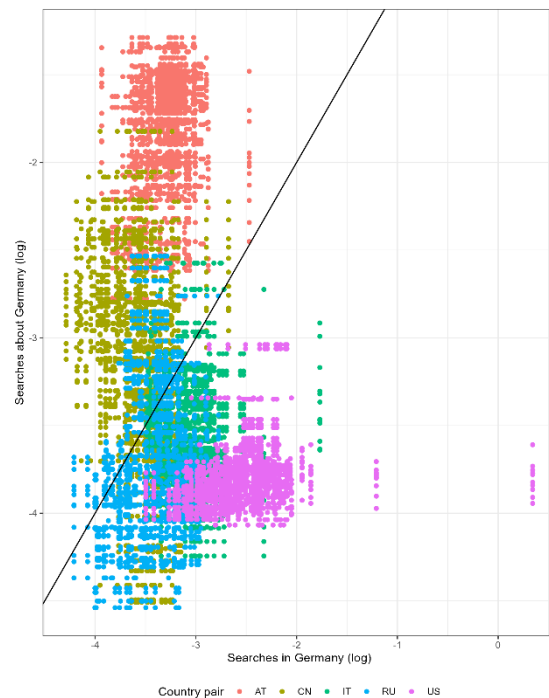
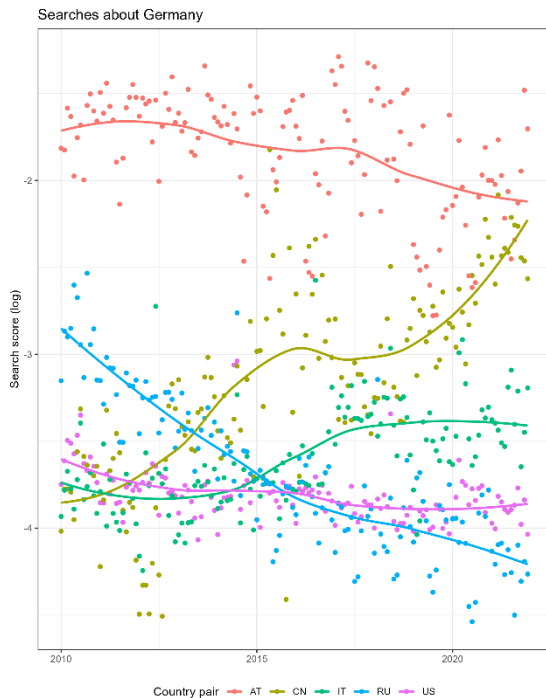
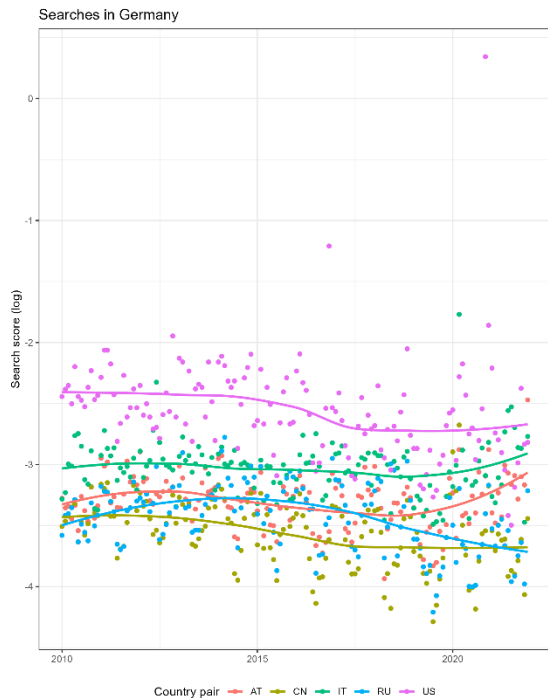
„Absence“ of distance

Free cross-national information flows

- The greater information gathering in country A about country B
 - > the greater the information flows from country B to country A
 - > the “more absent” the unidirectional distance between country A and country B
- Search volume on Google as **proxy for online information gathering** by individuals
 - Search engines are an essential channel by which to access information
 - Greater search volumes for a topic signifying greater public attention -> information flows

**Data on Google searches lends itself to study attitudes,
awareness, and internationalization**

Unidirectional between-country Search Volume



What can you use it for?

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Information Supply vs. Information Demand

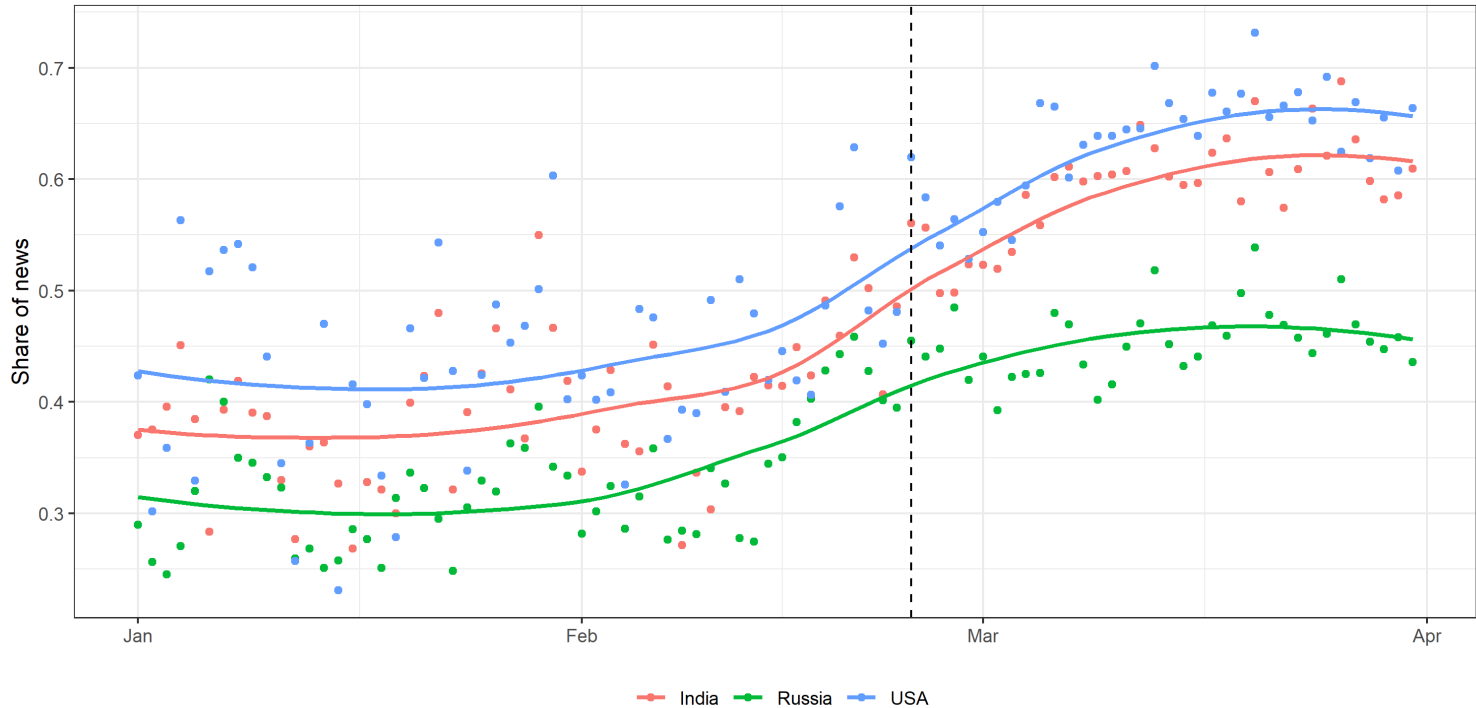
Focus of interest:

- **Search volume** about news in a given country
- Search volume signifies **individual information seeking**
- **Differences** between “official” media reporting and “individual” searches
- Differences indicate **reliability of institutions** and **cost of information seeking**

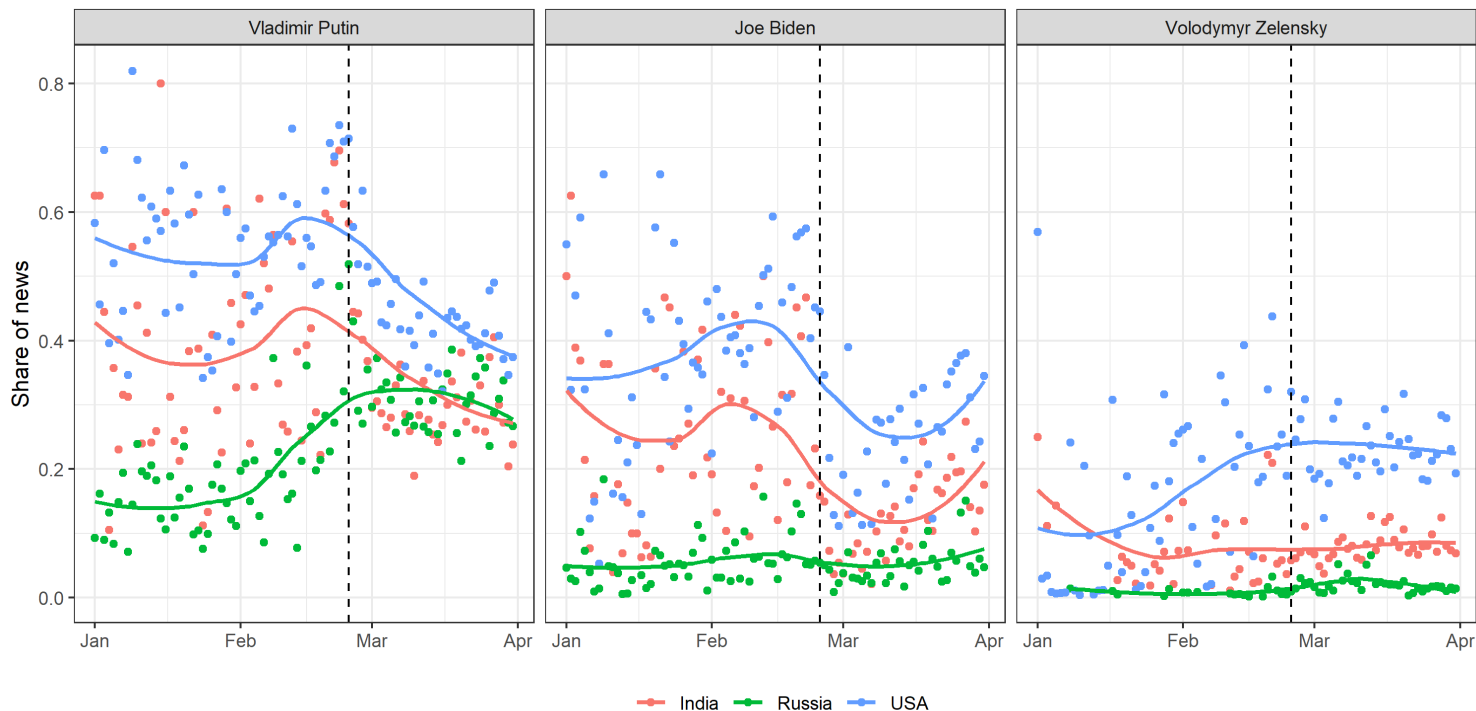
Conceptualization:

- In a perfect world **media supplies** the information that is **demanded by individuals**
 - Individual (online) information seeking would resemble information in media
- Comparison between information seeking and media shows **potential “filter”**
 - Particular relevance when government interferes with media -> Russian invasion in Ukraine
- Working paper available on SSRN ([link](#))

Media Mentions of Ukraine (Jan-Apr 2022)



Media Mentions of Ukraine – by selected Individuals



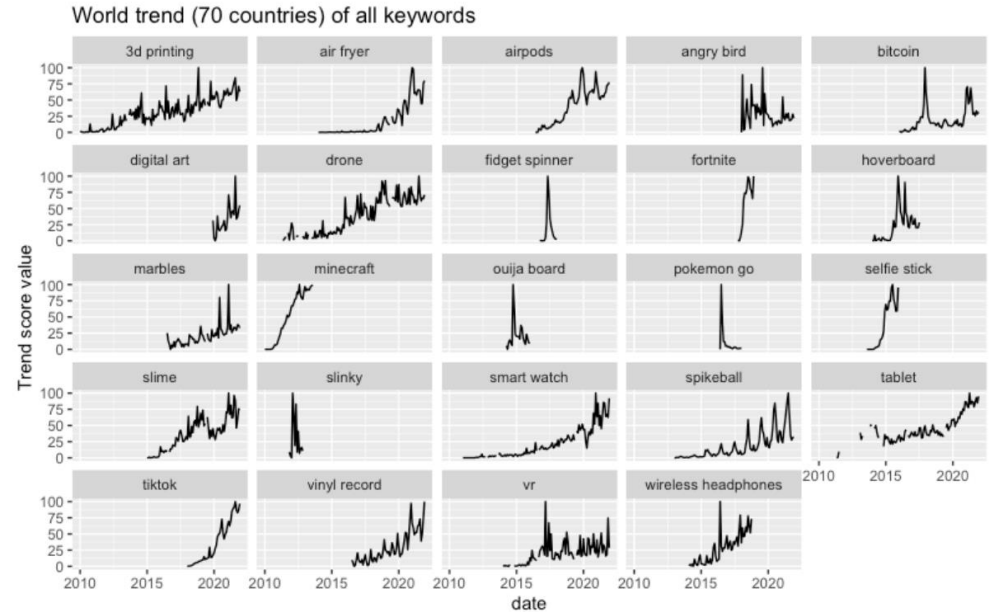
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Pattern Analysis

- Google Trends Time Series can be used to study diffusion of phenomena across the globe (e.g. products, trends, ideologies, diseases)
- In a preliminary application, we downloaded Google Trends Data for 24 fast-growing consumer products
- Running Granger causalities tests between all countries and the world trend series, we identify causal „trendsetting countries“.

Figure A1 Trend scores of all selected keywords across the world scope



Pattern Analysis

We find that cultural proximity is more predictive of trend diffusion than geographical proximity

Figure 2 DOI for all keywords across aggregated country clusters

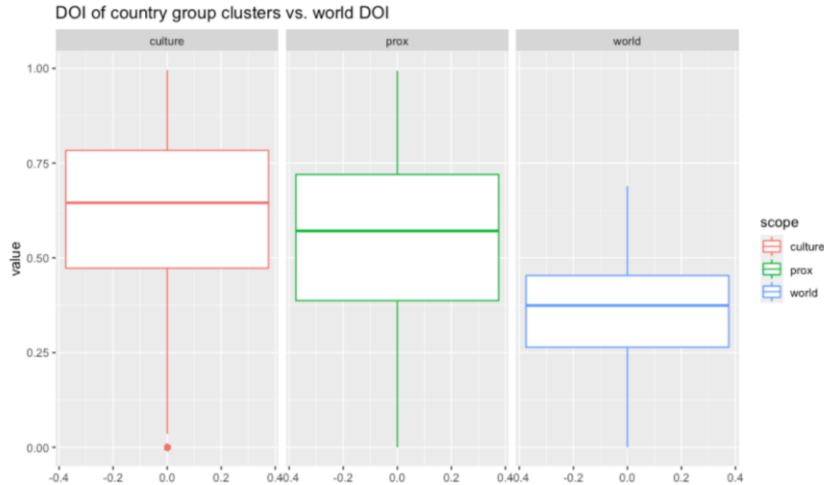
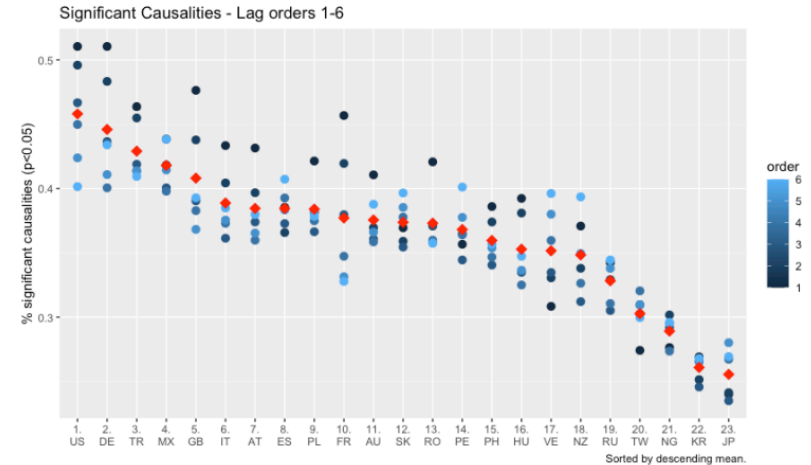


Figure 8 Percentage of significant causalities per lag and country - Lags 1-6



3.2

THE GDELT PROJECT

GDELT

The GDELT Project

The Global Database of Events, Language and Tone monitors the **world's broadcast, print, and web news from nearly every country**. GDELT identifies **people, locations, organizations, themes, sources, and emotions** mentioned in these news items. The project offers a free open platform for data access to over 4 billion geo-located events, reported in over 100 languages and sourced from a diverse feed of sources.

Freely available at:

<https://www.gdeltproject.org/>

- GDELT consists of several datasets
- The two central datasets of GDELT are:
 - <https://blog.gdeltproject.org/gdelt-2-0-our-global-world-in-realtime/>
 - Global Knowledge Graph
 - Event Database
- GDELT provides updates to its data every 15 minutes

GDELT Event Database

- Events are identified from news items
- Events are coded by:
 - Actors mentioned
 - Type, location, religion of actor
 - Type of event
 - Sentiment of reports about events
- The Event Database covers nearly 670 million events
- The Event Database covers about 270 GB of data

GLOBAL EVENT ID	DATE	Month	Year	Fraction	Date	Actor1 Code	Actor1 Name	Actor1 Country	Actor1 Known	Actor1 Ethnic	Actor1 Coc	Actor1 Religion1	Actor1 Religion2	Actor1 Type1	Actor1 Type2	Coc
1079185557	20230108	202301	2023	20230108	20230108											
1079185567	20230108	202301	2023	20230108	20230108											
1079185618	20230108	202301	2023	20230108	20230108	COP	POLICE OFFICER							COP		
1079185622	20230108	202301	2023	20230108	20230108	COP	POLICE OFFICER							COP		
1079185623	20230108	202301	2023	20230108	20230108	COP	POLICE							COP		
1079185642	20230108	202301	2023	20230108	20230108	CVL	VILLAGER							CVL		
1079185643	20230108	202301	2023	20230108	20230108	CVL	VILLAGER							CVL		
1079185646	20230108	202301	2023	20230108	20230108	CVL	VILLAGER							CVL		
1079185706	20230108	202301	2023	20230108	20230108	GOV	CHIEF MINISTER							GOV		
1079185710	20230108	202301	2023	20230108	20230108	GOV	CHIEF MINISTER							GOV		
1079185713	20230108	202301	2023	20230108	20230108	GOV	MAYOR							GOV		
1079185763	20230108	202301	2023	20230108	20230108	IRL	LIMERICK	IRL								
1079185771	20230108	202301	2023	20230108	20230108	JUD	LAWYER							JUD		
1079185789	20230108	202301	2023	20230108	20230108	LEG	SENATOR							LEG		
1079185796	20230108	202301	2023	20230108	20230108	MDV	MALE	MDV								
1079185809	20230108	202301	2023	20230108	20230108	MIL	ARMY							MIL		
1079185907	20230108	202301	2023	20230108	20230108	UAF	MILITANT									
1079185955	20230108	202301	2023	20230108	20230108	USAGOV	JOE BIDEN	USA						GOV		
1079185963	20230108	202301	2023	20230108	20230108	USAREL	NEW ORLEANS	USA								
1079184843	20230108	202301	2023	20230108	20230108											
1079184935	20230108	202301	2023	20230108	20230108	COP	POLICE							COP		
1079184942	20230108	202301	2023	20230108	20230108	COP	POLICE							COP		
1079184945	20230108	202301	2023	20230108	20230108	COP	POLICE							COP		
1079184953	20230108	202301	2023	20230108	20230108	CVL	COMMUNITY							CVL		

Measuring Geopolitical Relationships in GDELT

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Leviathan as foreign investor: Geopolitics and sovereign wealth funds

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²Department of Business Administration, Georgia Institute of Technology, Atlanta, GA 30332, USA
³Department of Public Policy, Texas State University, San Marcos, TX 78666-1044, USA
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e-mail: dswang@utexas.utexas.edu

Abstract
Sovereign wealth funds (SWFs) are important but understudied state investors. We investigate whether geopolitics influences SWF foreign acquisitions, selling and how their FDI patterns differ from those of private firms. Theoretical expectations are mixed. On the one hand, limited managerial control of target firms suggests that SWFs may be unable to pursue political goals, and thus they are no more sensitive to geopolitics than private firms. On the other hand, state ownership of SWFs can generate national security externalities and thereby makes SWFs more sensitive to geopolitics, tilting more high data measures of cooperation and adversarial relations based on media reporting and three different tests. We examine four SWF cross-border acquisitions by SWFs and private firms. We find that home host conflict burden SWFs more than private firms. SWFs are more sensitive to geopolitics than private firms. SWFs' lack of managerial control of target firms, state ownership moderates geopolitical influence on their cross-border acquisitions and makes them more sensitive than private firms to interstate relations. Our findings suggest that government concerns over FDI by state entities goes beyond their operational activities.

Keywords: Liability of foreignness; political relationships; governments; SWF; host country relations; foreign acquisition; state-owned enterprise

INTRODUCTION
The 21st century has witnessed a dramatic rise in state capitalism. State entities, which used to operate primarily domestically, have become some of the world's largest international actors, and have attracted wide attention in academic and policy circles (Brenner, 2009; Muscatelli, Lazzarini, & Aguilera, 2015; Rottke, 2016). A vibrant stream of research, surveyed in Cuervo-Casas et al. (2014) and Muscatelli and Lazzarini (2016), studies whether and how state-owned multinational firms differ from private sector firms in FDI patterns (Chaudhry, 2016; Knutsen et al., 2011). This literature focuses primarily on comparing the foreign expansion of private firms with state-owned operating enterprises (termed SOEs here). Surprisingly, another class of state-led investors – sovereign wealth funds (SWFs) – has received limited attention in the literature. SWFs are state entities that invest their home countries' budgetary surpluses abroad, through both mergers & acquisitions

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Centered Conflict & Cooperation Events



Wang, D., Weiner, R. J., Li, Q., et al. (2021): Leviathan as foreign investor: Geopolitics and sovereign wealth funds. In: Journal of International Business Studies, 52, 1238–1255.

Application on an actor level

- [Jamison, Tadmor & Henisz \(2025\)](#)
- GDELT allows users to identify focal actors using the Conflict and Mediation Event Observations (CAMEO)
- Identify both the source and the target involved in the event
- The Goldstein Scale indicates the degree of conflict
- Location Matching with Prio-Grid allows geographical identification of events



Indigenous peoples' reactions to foreign direct investment: a social movement perspective

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Abstract

A growing body of literature highlights that large-scale investments in sensitive contexts can undermine both firm financial performance and peace-positive development. We investigate whether and under what conditions foreign direct investment (FDI) proximate to Indigenous land claims increases or decreases conflict. Drawing on social movement theory's identification of powerful frames and political opportunity structures as drivers of mobilization, we predict that FDI proximate to Indigenous land claims will promote conflict. We leverage novel data on the global location of Indigenous land claims and a global corpus of more than 4 billion news articles. We find that when locations with Indigenous land claims are treated with FDI, we observe an increase in media-reported armed conflict events. We further argue and find this effect to be driven by rebels acting on behalf of Indigenous people who target (multinational) corporations and the governments who offer them the formal license to operate. These negative effects are found across a wide range of industries. Our results underscore that for investments in sensitive socio-political contexts, such as Indigenous lands, firm performance and the livelihoods of community members are heavily influenced by conflict risk mitigation efforts.

Keywords Institutional context · Civil society · Political risk · Longitudinal (or time-series) · Theory of FDI and the MNE (ownership–location–internalization) · Indigenous

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Introduction

In recent decades, conflicts between Indigenous peoples and corporations operating on their traditional territory have frequently made the news. Multinational corporations, such as Danone, are exacerbating the ongoing water crisis in Mexico's Puebla Valley (Pearson, 2022), leading to protests by local Indigenous populations and water rights activists. Vedanta's aluminum mining project in India's Niyamgiri Hills jeopardized the cultural, spiritual, and economic survival of the Dongria Kondh tribe by threatening their sacred lands and disrupting their traditional way of life (Amnesty International, 2010), again leading to action by domestic and international activist groups, which induced the project's eventual halt and significant financial losses for Vedanta. These are often lose–lose situations, with Indigenous people losing life, land, and/or health (Kennedy et al., 2023; Scheidel et al., 2023; Tomperet al., 2020), while corporations face financial and reputational costs (Birss & Sirén Gualinga, 2022).

The literature regarding non-Indigenous corporations operating in Indigenous lands has focused on such conflicts



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Discussion

- New Big Data sources
 - Open up new opportunities for measuring Management-relevant concepts
 - Allow for more sophisticated methods
- Practitioners have embraced and integrated these new sources of data in their value chains
 - Finance
 - IT....
- Hypocrites calling: Do as I say, not as I do!
 - Academic research has not embraced the Big Data revolution
 - Reviewers, editors and journal resist change & new measures
 - Technological innovation and big data growth has outpaced publication cycles