

Measuring Geopolitical Risk

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Geopolitical Risks Receive a Lot of Attention

Geopolitical risks are often cited by policy-makers, investors, and media as key determinants of economic decisions.

- 75% of investors worry about geopolitical risk (Gallup Survey 2017).
- Geopolitical risk salient risk to outlook for [BoE](#), [ECB](#), [IMF](#), [WB](#).

Higher geopolitical risks can:

1. Heighten perception of disastrous outcomes
2. Make investment in risky projects less attractive.
3. Lower consumer confidence

Do Geopolitical Risks Have Economic Consequences?

How Do We Measure Them?

What We Do: Definition and Measurement

1. Construct text-based indicator of geopolitical risk—GPR Index—measuring frequency of articles in leading newspapers discussing adverse geopolitical events.
 - ▶ Focus on wars, terrorism, tensions between states;
2. Separate **threats** of adverse geopolitical events from their **realization and escalation**.

GPR Index highly correlated with narrative measure of geopolitical risk.

GPR Index correlated with firms' own assessment of geopolitical risks.

What We Do: Empirical Evidence

- **Aggregate analysis:**

Higher GPR reduces investment, employment, and stock returns.

Effects driven both by **threat** of adverse geopolitical events and by their **realization**.

Higher GPR is also associated with increased probability of disaster outcomes, and has large effects on the tail of the GDP distribution.

- **Firm-level analysis:**

Reduction in firm-level investment stronger for firms highly exposed to aggregate GPR.

Idiosyncratic GPR reduces firm-level investment

Definition: Geopolitics and Geopolitical Risk

- Geopolitics: how geography affects politics and relations among states.
- **Geopolitical Risk** is the threat, realization, and escalation of adverse events associated with wars, terrorism, and any tensions among states and political actors that affect the peaceful course of international relations.
- The GPR index is a continuous measure of risk. Higher values measure:
 - ▶ higher current intensity of negative events (e.g. more wars)
 - ▶ higher probability of negative events in the future
 - ▶ higher expected intensity of future negative events

Measurement: Newspaper Searches

- The geopolitical risk (GPR) index is measured by the **frequency** of newspaper articles discussing adverse geopolitical events.

$$GPR \propto \frac{\mathcal{G}}{\mathcal{U}}$$

\mathcal{G} : articles mentioning adverse geopolitical events;

\mathcal{U} : total number of articles

- **Recent index (from 1985)**: Chicago Tribune; Los Angeles Times; NYT; WSJ; WaPo; Phil.Enquirer; Daily Telegraph; FT; Guardian; The Globe and Mail.
- **Historical index (since 1900)**: NYT, Chicago Tribune, and WaPo
- Risks as covered/perceived by the English-speaking press.

Measurement: Selecting Terms in set \mathcal{G}

- We create query comprising two bags of words, the first bag containing topic words (e.g. war words, nuclear words, terrorism words), the second bag containing either “threat” or “act” words for each topic.
- The selection of topic words is based on:
 - ▶ definition of the phenomenon itself;
 - ▶ human reading and textual analysis of 44,000 front pages of NYT from 1900 through 2020;
 - ▶ extensive analysis of key dates and language used by the newspapers of that period in describing geopolitical events and their synonyms.
- Notes:
 - ▶ We exclude from searches articles containing words (such as movie, anniversaries, obituaries, books) associated with false positives.
 - ▶ We account for the evolution of language over time.

The Search Terms

A. Search categories and search queries

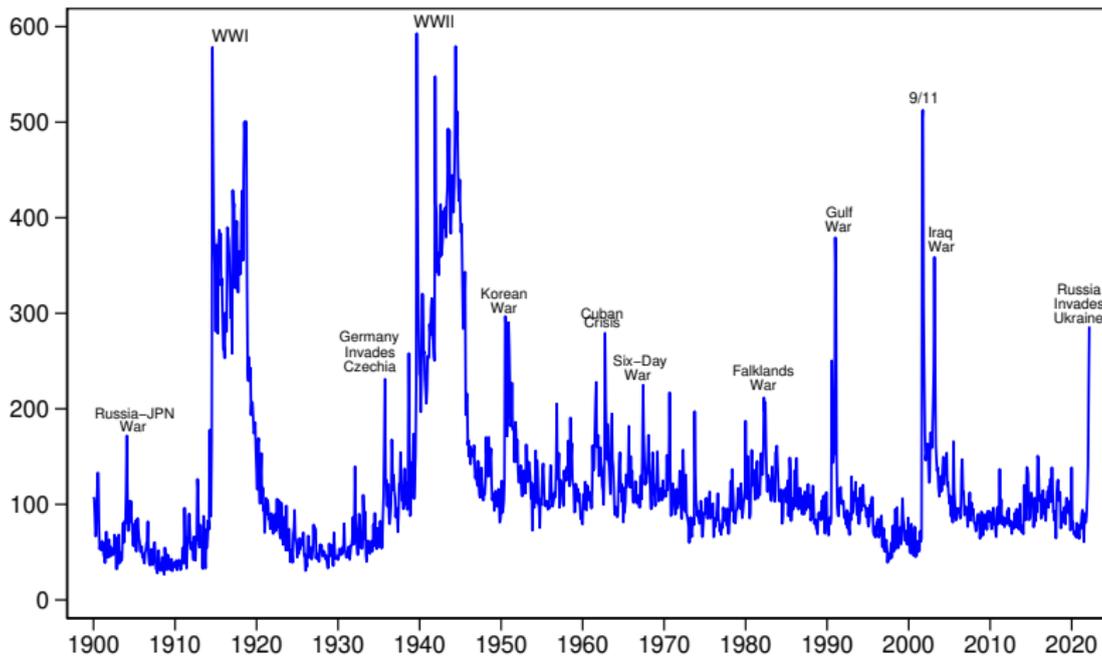
	<i>Category</i>	<i>Search Query</i>	<i>Peak (Month)</i>
War Threats	1. War risks	War_words N/2 Risk_words	Sudetenland German occupation (September 1938)
	2. Peace threats	Peace_words N/2 Peace_disruption_words	Iran Crisis of 1946 (April 1946)
	3. Military buildup, sanctions, embargoes	Military_words AND buildup_words	Iraq invades Kuwait (August 1990)
	4. Nuclear Threats	Nuke_bigrams AND Risk_words	Nuclear Ban Treaty Negotiations (August 1963)
	5. Terrorist Threats	Terrorism_words N/2 Risk_words	9/11 (October 2001)
War Acts	6. Beginning of war	War_words N/2 War_begin_words	Pearl Harbor (December 1941)
	7. Escalation of war	Actors_words N/2 Actors_fight_words	Battle of Normandy (D-Day) (June 1944)
	8. Terrorist Acts	Terrorism_words N/2 Terrorism_act_words	9/11 (September 2001)

The Search Terms

B. Search words

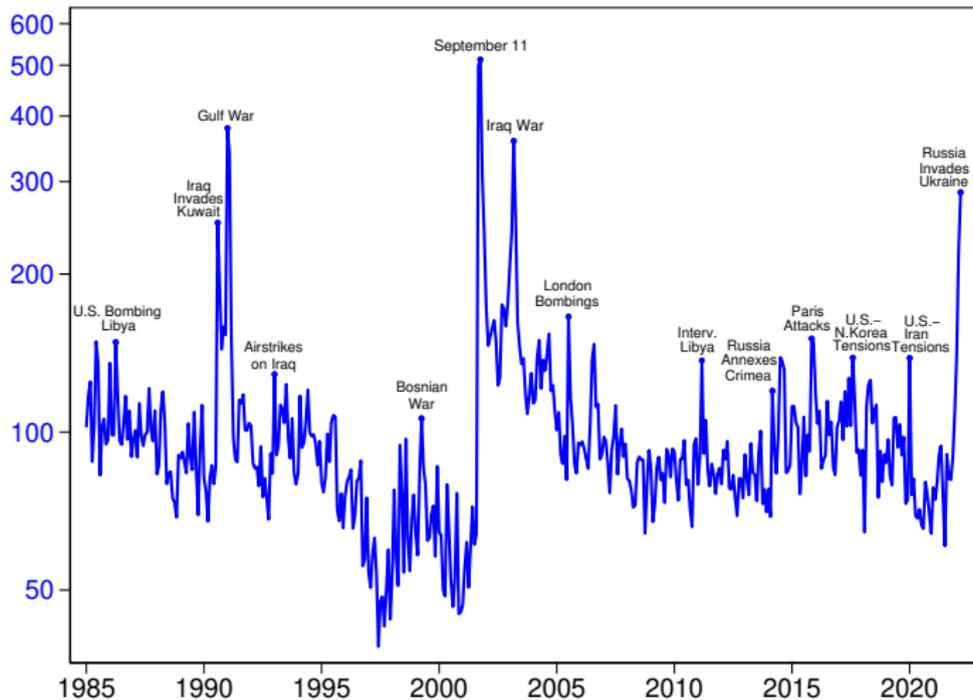
<i>Topic Bags</i>	<i>Exact Phrases</i>
War_words	war OR conflict OR hostilities OR revolution* OR insurrection OR uprising OR revolt OR coup OR geopolitical
Peace_words	peace OR truce OR armistice OR treaty OR parley
Military_words	military OR troops OR missile* OR "arms" OR weapon* OR bomb* OR warhead*
Nuke_bigrams	"nuclear war*" OR "atomic war*" OR "nuclear missile*" OR "nuclear bomb*" OR "atomic bomb*" OR "h-bomb*" OR "hydrogen bomb*" OR "nuclear test"
Terrorism_words	terror* OR guerrilla* OR hostage*
Actor_words	allie* OR enem* OR insurgen* OR foe* OR army OR navy OR aerial OR troops OR rebels
<i>Risk/Act Bags</i>	<i>Exact Phrases</i>
Risk_words	risk* OR warn* OR fear* OR threat* OR concern* OR danger* OR doubt* OR crisis OR troubl* OR disput* OR tension* OR imminen* OR inevitable OR footing OR menace* OR brink OR scare OR peril*
Peace_disruption_words	threat* OR menace* OR reject* OR peril* OR boycott* OR disrupt*
Buildup_words	buildup* OR build-up* OR sanction* OR blockad* OR embargo OR quarantine OR ultimatum OR mobilis*
War_begin_words	begin* OR start* OR declar* OR begun OR began OR outbreak OR "broke out" OR breakout OR proclamation OR launch* OR wage*
Actor_fight_words	advance* OR attack* OR strike* OR drive* OR shell* OR offensive OR invasion OR invad* OR clash* OR raid* OR launch*
Terrorism_act_words	attack OR act OR bomb* OR kill* OR strike* OR hijack*

The Geopolitical Risk Index



Note: Data from Historical Index until 1984, and from Recent Index from 1985. Index equals 100 in the 1985-2019 period.

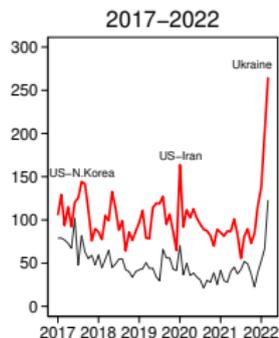
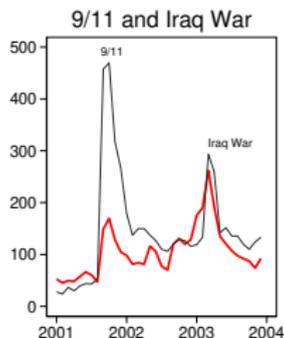
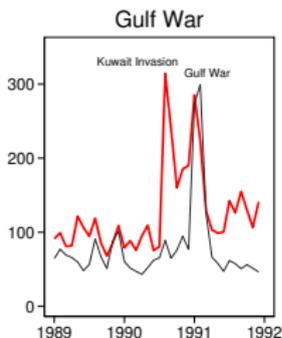
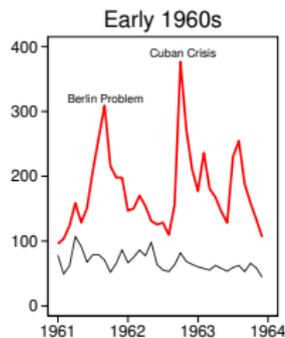
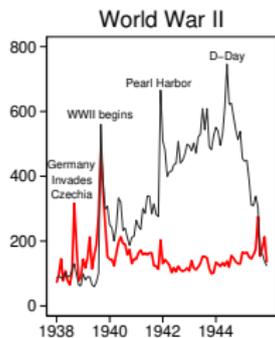
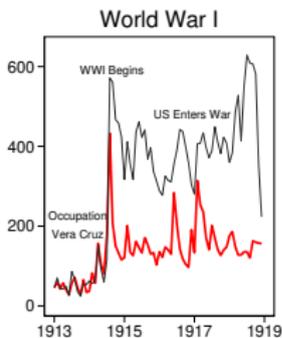
The Recent Geopolitical Risk Index



Geopolitical Threats and Geopolitical Acts

- GPR index captures a convolution of shocks to various moments of the distribution of geopolitical events.
- We break the index down into:
 - ▶ Geopolitical Threats (GPT): Search categories 1 to 5;
 - ▶ Geopolitical Acts (GPA): Search categories 6 to 8.
- **Main idea:** Many spikes in GPT and GPA associated with realization of geopolitical acts...
- ... Yet, some movements in GPT may happen when no underlying act materializes.

Geopolitical Threats and Geopolitical Acts



Is the Index Plausible?

- Does the Index Pass a Plausibility Test?
- Could Changes in the Use of Language Matter?
- How Does the Index Compare with Other Indicators of Conflict and War News?

Newspaper Headlines

"All the News That's Fit to Print." **The New York Times.** LATE CITY EDITION

VOL. LXXXII—No. 30,000
NEW YORK, SATURDAY, JUNE 30, 1945
THIRD CLASS PERMIT NO. 1757 POST OFFICE NEW YORK, N. Y.

**HITLER DEMANDS FULL FRENCH SURRENDER;
BORDEAUX CONSIDERING 'YES OR NO' REPLY;
U. S. OUTLINES ECONOMIC WAR FOR AMERICAS**

BOOK FOR WILLKIE Senate Hearings Ordered DEFENSE IN TRADE BRITAIN IS BOMBED The International Situation CEREMONY IS BRIEF

REPLY TO HIS WAY? On Stimson's Nomination In Europe and Africa

"All the News That's Fit to Print." **The New York Times.** LATE CITY EDITION

VOL. LXXXII—No. 30,000
NEW YORK, FRIDAY, AUGUST 3, 1945
THIRD CLASS PERMIT NO. 1757 POST OFFICE NEW YORK, N. Y.

DEMOCRATS ELECT FLYNN CHAIRMAN TO SUCCEED FARLEY **200,000 Children Seek Haven; Drives Here Asks Funds for Them** **JAPAN'S NEW ORDER EXPANDED TO COVER GREATER EAST ASIA** **GOVERNOR CREATES A DEFENSE COUNCIL FOR STATE SPEED-UP** **AERIAL WARFARE SLACKENS BUT EACH SIDE RAIDS A CITY; MOLOTOFF SEES U. S. IN WAR**

WILSON BEATS LEADER WILL TAKE US DUTY OF CONGRESS EARLY ON AUG. 17

OLD FRIEND OF ROOSEVELT A SUPPORTER OF STIMSON

THE WAR IN EUROPE

BRITISH EXPECT TROUBLE

WAVE NO TIME TO LOSE

THE WAR IN EUROPE

BRITAIN'S CHIEF VICTIMS, NAZIS SAY—NORWICH

"All the News That's Fit to Print." **The New York Times.** LATE CITY EDITION

VOL. LXXXII—No. 30,000
NEW YORK, SUNDAY, JANUARY 30, 1934
THIRD CLASS PERMIT NO. 1757 POST OFFICE NEW YORK, N. Y.

OPEN DOOR IN CHINA PLEDGED BY HITLER; A LONG WAR IS SEEN **Prize in Court Before the Faculty** **FULL REBEL POWER HURLED AT TIBET; VITAL HILL SEIZED** **Violent Magnetic Storm Disrupts Short-Wave Radio Communication** **Transoceanic Services Transfer Plane and Sun Spot Disturbance Strikes** **CITY BUDGET SUIT DEMANDS FULL PAY FOR DISPUTED JOBS** **Income Tax on a Willing War Field for \$100 to \$1** **U. S. STEEL PLANS \$20,000,000 OUTLAY FOR PLANT RENOVAL**

INTERNALS OF PEACE WILL BE PRESIDENT, FOREIGN STATESMEN TALK IN JAPANESE SUIT

FREE COOPERATION URGES

REPORT HIS LOSSER HIGH

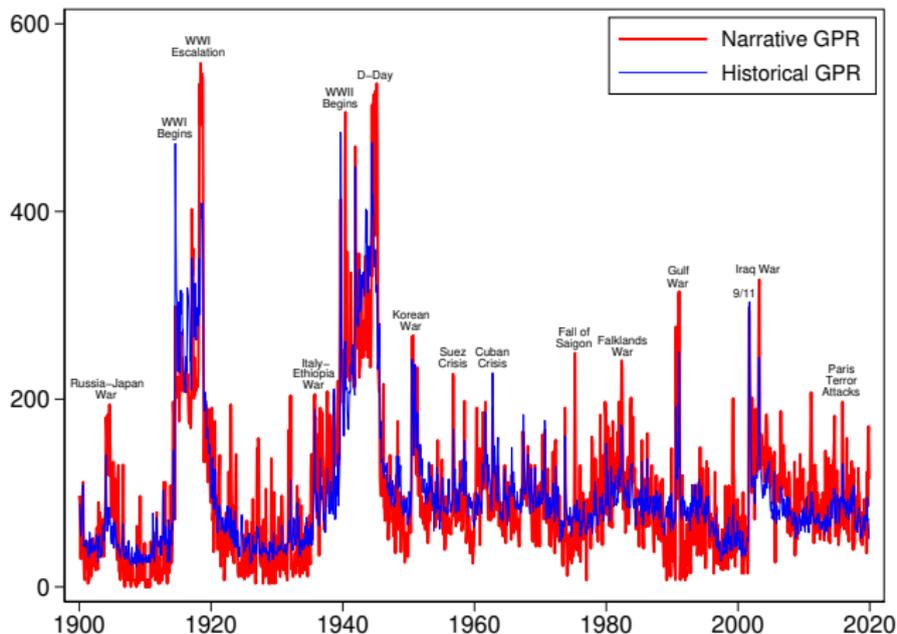
ACT OF NEW COUNCIL AFFAIRS IN FINE OF CLERK FOR RATE VOTED BY MEMBERS

RID OF TARRANT HINTED

LINKS PRICES TO PAY RISE

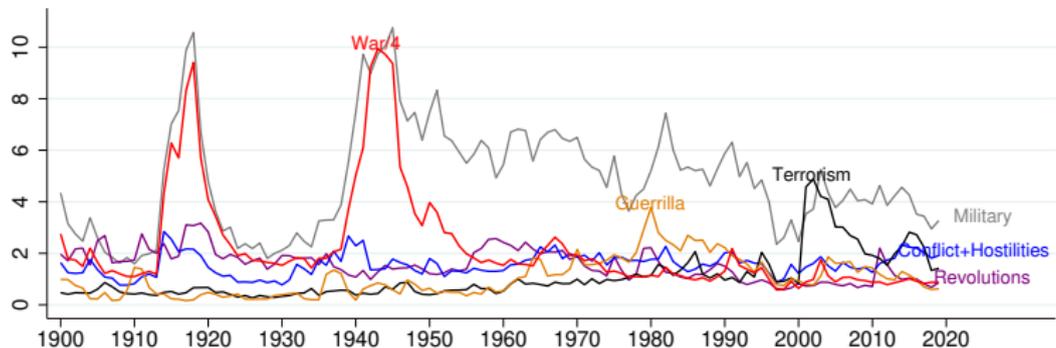
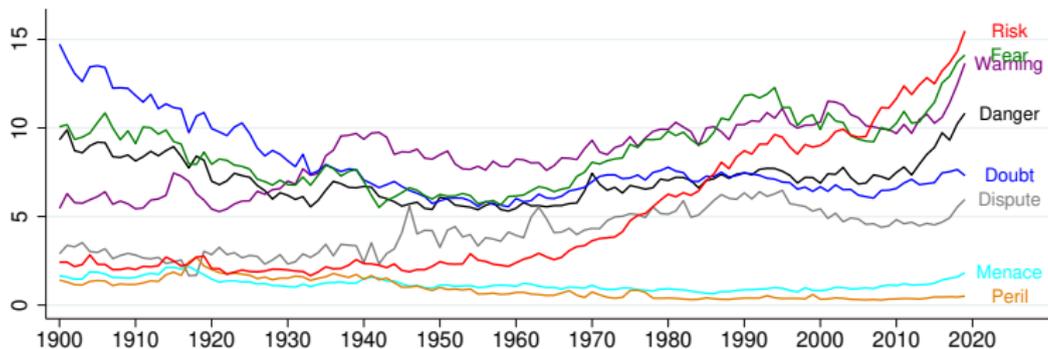
The Narrative GPR Index

We read 44,000 daily front pages of NYT and code them 0, 1, 2, or 5 depending on coverage of geopolitical events

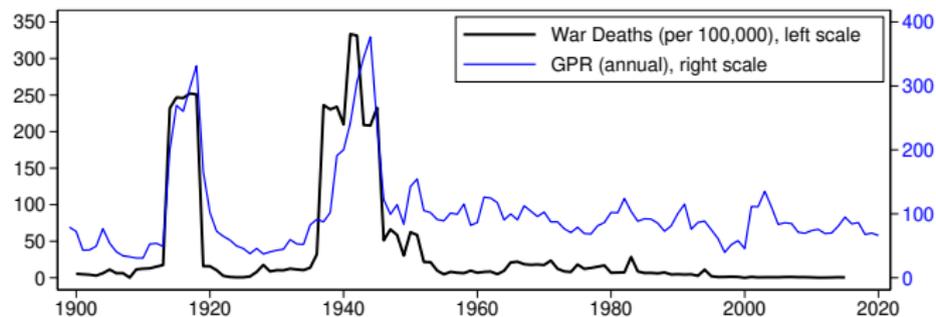
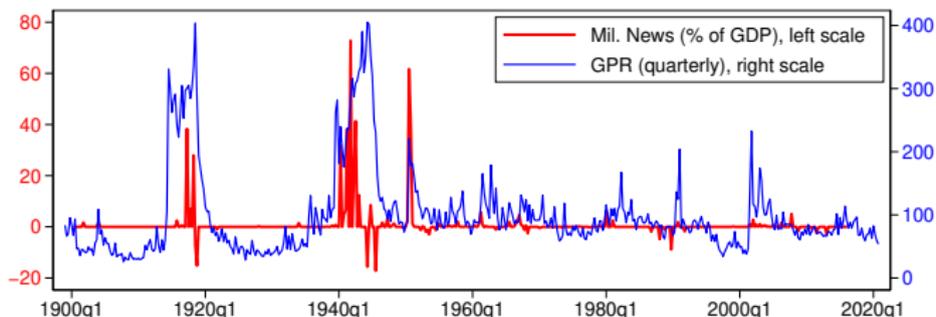


Note: Data from 1900 through 2019. Both series indexed to 100 in the 1900-2019 period.

Use of Words over Time



GPR and Other War Indicators



NOTE: Time-Series Comparison of GPR Index and GPR shocks with Military News variable from Ramey (2011) and with war deaths.

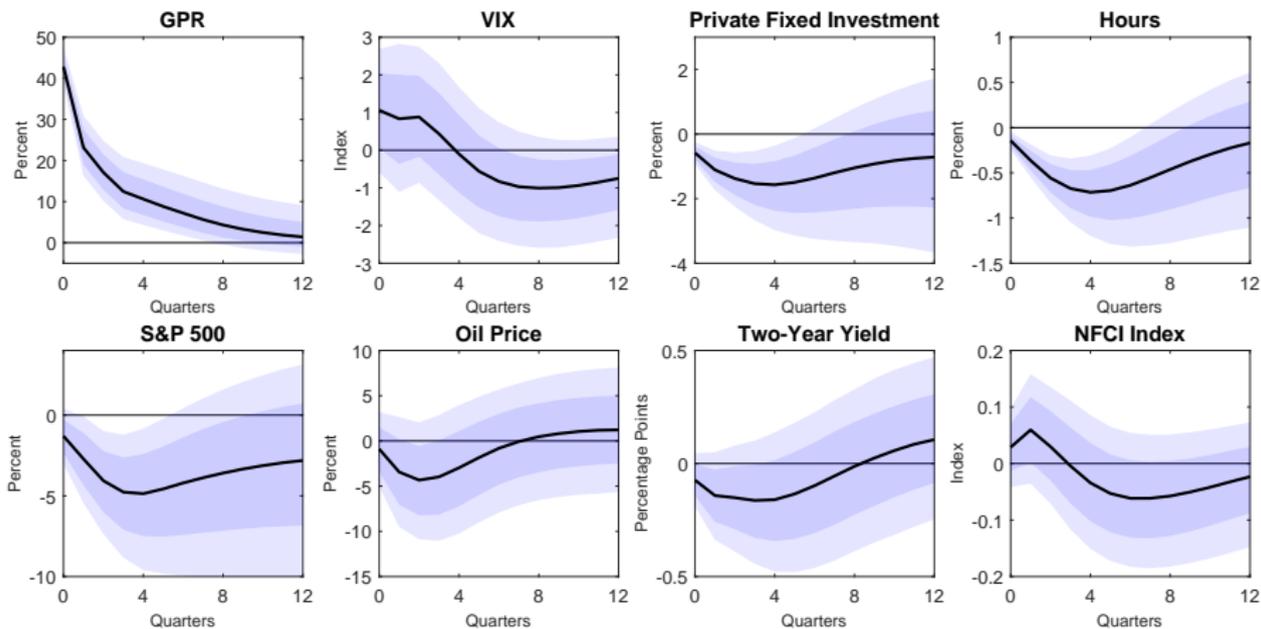
Geopolitical Risk and Economic Activity

1. VAR Evidence for the United States since 1985: Threats matter as much as acts
2. Panel Regressions since 1900: GPR predicts economic disasters across countries
3. Panel Quantile Regressions since 1900: How GPR affects distribution of economic variables across countries

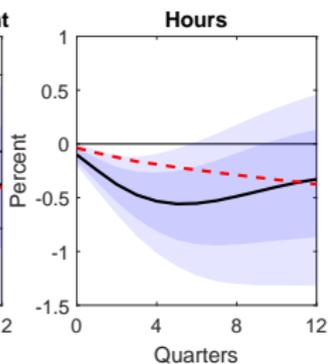
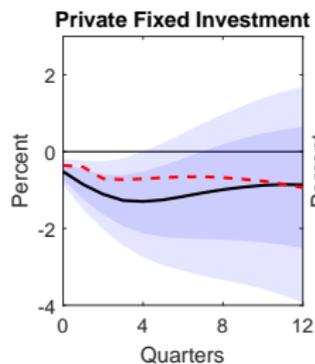
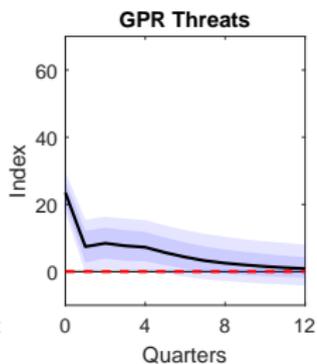
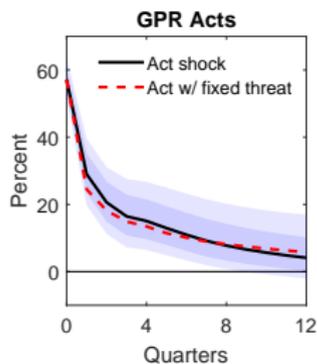
Quarterly VARs: Threats and Acts

- **GPR Specification:** LGPR, VIX, BFI, EMP, S&P500, OIL, T02YR.
- **Acts vs. Threats:** Replace LGPR with LGPA & LGPT
- Identification (I): Cholesky with GPR indexes ordered before economic variables \Rightarrow **Contemporaneous** exogeneity.
- Identification (II): LGPA ordered 1st and LGPT 2nd in Cholesky
 - ▶ **GPA shocks** capture realization of adverse geopolitical events.
 - ▶ **GPT shocks** capture higher threat of adverse geopolitical events.
- Sample: 1985Q1-2019Q4

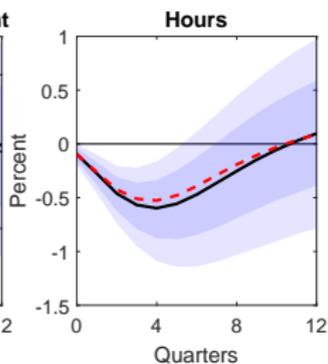
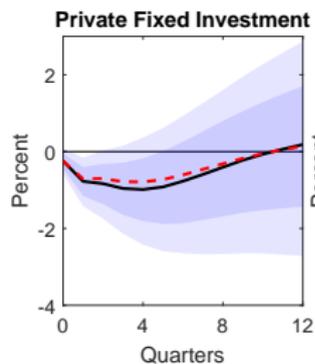
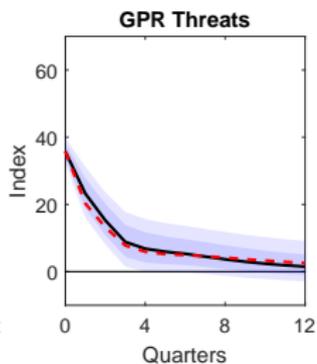
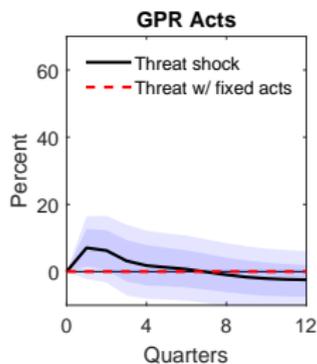
Quarterly VAR: 2-SD GPR Shock



Quarterly VAR: 2-SD GPA Shock



Quarterly VAR: 2-SD GPT Shock



Geopolitical Risk and Economic Activity

1. VAR Evidence for the United States since 1985: Threats matter as much as acts
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Geopolitical Risk and Tail Risks

- Does GPR affect probability of economic disaster / conditional distribution of macroeconomic variables? **Yes**
- We use yearly data for a panel of 26 countries. Sample runs from 1900 through 2019.
- For each country, we construct a country-specific measure of geopolitical risk controlling for relative intensity of GPR in that country.

Geopolitical Risk and Economic Disasters

- Is high GPR associated with higher probability of economic disaster?

Table 3: Geopolitical Risk and Economic Disasters

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	Disaster	Disaster	Disaster	Disaster	Disaster	Onset	Ending
GDP Growth t-1	-0.0071* (0.0030)	-0.0062* (0.0030)	-0.0056 (0.0030)	-0.0065 (0.0032)	-0.0056* (0.0026)	-0.0009 (0.0010)	0.0012 (0.0010)
GPR	0.1753*** (0.0223)	0.1144*** (0.0241)	0.0337 (0.0469)		0.1001*** (0.0236)	0.0180 (0.0237)	-0.0175 (0.0094)
Country GPR		0.0940*** (0.0160)	0.0842*** (0.0170)		0.0794*** (0.0175)	0.0664* (0.0295)	-0.0090 (0.0105)
Dummy WWI/WWII			0.3328 (0.1761)				
GPR Spikes				0.1692*** (0.0246)			
Country GPR Spikes				0.0821*** (0.0122)			
Dummy Pre-1946					0.2437*** (0.0490)		
Dummy 1946-1972					0.1152* (0.0467)		
Constant	0.2309*** (0.0252)	0.2289*** (0.0273)	0.1947*** (0.0341)	0.1762*** (0.0302)	0.1112** (0.0320)	0.0401* (0.0185)	0.1180*** (0.0130)
Observations	3,056	3,056	3,056	3,056	3,056	2,447	609
R ²	0.20	0.20	0.21	0.18	0.26	0.13	0.02
Countries	26	26	26	26	26	26	26
Country Fixed Effects	No	Yes	Yes	Yes	Yes	Yes	Yes

Standard errors in parentheses clustered by country and year.

* $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Geopolitical Risk and Quantile Regressions

- Does GPR affects the shape of the conditional distribution of macroeconomic variables?

Table 4: Quantile Regression Effects of Country-Specific Geopolitical Risk

	(1)	(2)	(3)
	GDP Growth(t+1)	TFP Growth(t+1)	Military Exp.(t+1)
OLS	-0.35 (0.22)	-0.22 (0.27)	2.15*** (0.39)
Quantile			
q50	-0.24 (0.22)	-0.04 (0.14)	0.63** (0.19)
q10	-1.44* (0.63)	-1.86*** (0.45)	0.16*** (0.03)
q90	0.30 (0.30)	1.53** (0.55)	7.08*** (0.55)
Observations	3082	2261	2681
Countries	26	19	26

Standard errors in parentheses

* $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Firm-Level Effects of Geopolitical Risk

- Two questions:
 - ▶ Do firms in **industries** more exposed to aggregate geopolitical risks experience a larger decline in investment? Yes
 - ▶ Are there **idiosyncratic** geopolitical risk events that drive variation in investment at the firm level? Yes
- Conceptual framework:

$$GPR_{i,t} = GPR_t + GPR_t \Lambda_k + Z_{i,t}.$$

- ▶ Λ_k is industry-exposure to aggregate GPR
- ▶ $Z_{i,t}$ is idiosyncratic geopolitical risk.
- ▶ Goal: To measure the effects of $GPR_t \Lambda_k$ and $Z_{i,t}$ on firm investment

Industry Effects of Geopolitical Risk

Construction of Industry Exposure

- Construct stock-market based measure of Fama-French 48-group **industry** exposure to geopolitical risk using daily regressions of industry excess returns on GPR:

$$R_{k,t} = \alpha_k + \beta_k \Delta GPR_t + \varepsilon_{k,t},$$

- $\Lambda_k = -\text{sign}(\beta_k - \bar{\beta})$
 - ▶ More exposed (negative beta): Entertain, Transportation, Textiles.
 - ▶ Less exposed (positive beta): Gold, Oil, Defense.
- We estimate:

$$\log ik_{i,t+2} = \alpha_i [+ \alpha_t] + \beta_h (\Lambda_k \Delta \log GPR_t) + d X_{i,t} + \varepsilon_{i,t+2} \quad (1)$$

Firm-Level Effects of Geopolitical Risk

Construction of Firm-Level Exposure

Two steps:

1. Search the earnings call transcripts for geopolitical (GP) terms
 - ▶ E.g., *war**, *militar**, *terror**, *conflict**
 - ▶ Frequency of GP matches indicates the intensity of geopolitical risks in a conference call
2. Search transcripts for risk (R) terms in close proximity to GP terms
 - ▶ E.g., *risk**, *threat**, *tension**, *attack**
 - ▶ Must appear within **10** words

$GPR_{j,t}$ = Number of joint instances of GP and R (normalized by number of words in the call)

Firm-Level GPR on Investment

- Estimate:

$$\log ik_{i,t+2} = \alpha_i + \alpha_{k,t} + \gamma Z_{i,t} + d X_{i,t} + \varepsilon_{i,t+2} \quad (2)$$

- α_i and $\alpha_{k,t}$: firm and industry-time fixed effects
 γ : response of $\log ik$ in $t + 2$ to change in firm-level GPR ($Z_{i,t}$) in quarter t
- $\mathbf{X}_{i,t}$: firm cash flows and Tobin's Q, $\log ik_{i,t-1}$.

Effects of GPR at firm level

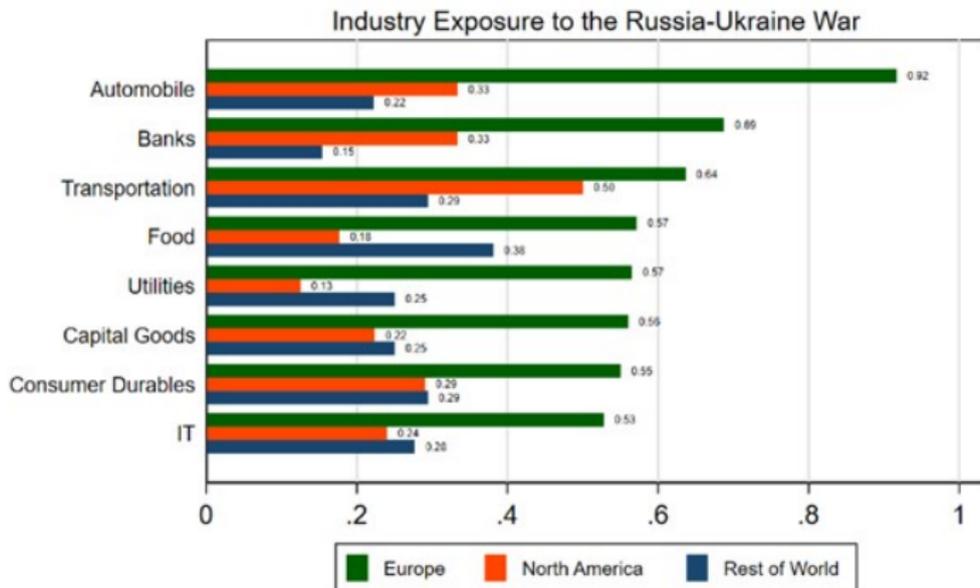
Table 5: Geopolitical Risk and Firm-Level Investment

$IK(t+2)$	(1)	(2)	(3)	(4)
$\Delta \text{GPR} \times \text{Dummy Industry Exposure}$	-0.67* (0.27)	-0.69* (0.26)		
GPR Firm-Level			-0.62* (0.30)	
ΔGPR	-1.37 (1.19)			
Political Risk Hassan et al.				-0.76** (0.25)
Cash Flow	2.71*** (0.46)	2.78*** (0.46)	2.64*** (0.37)	2.47*** (0.30)
Tobin's Q	8.92*** (1.68)	7.94*** (1.56)	8.94*** (0.95)	9.48*** (0.90)
$IK(t-1)$	0.31*** (0.01)	0.30*** (0.01)	0.24*** (0.01)	0.26*** (0.01)
Observations	375,300	375,300	94,978	112,262
Firm Fixed Effects	Yes	Yes	Yes	Yes
Time Effects	No	Yes	Yes	Yes
R-squared	0.45	0.47	0.59	0.58
Sample	85Q1-19Q4	85Q1-19Q4	05Q1-19Q4	05Q1-19Q4

Standard errors in parentheses

* $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$

Industry-Level Geopolitical Risks



Source: Staff calculations. Exposure is calculated as the fraction of firms' earnings call transcripts with mentions of the Russia/Ukraine War from March 1st 2022 - April 6th 2022. Industries are classified using the industry groups in the Global Industry Classification Standard with two modifications: Food comprises all industries in the Food, Beverage & Tobacco and Food & Staples Retailing groups while IT includes all industries in the Information Technology sector: Software & Services, Technology Hardware & Equipment, and Semiconductors & Semiconductor Equipment. Russian and Ukrainian firms are removed from the Europe region.

Geopolitical Risks and Inflation



Conclusions

- Geopolitical risk has adverse negative effects on real activity
 - ▶ The effect on investment varies across firms and industries.
- Adverse effects of geopolitical risk are driven by the threat and realization of adverse geopolitical events.
- On our GPR webpage—together with all data for the US—you can also find GPR index for many other countries.