Known knowns, known unknowns, and unknown unknowns

What do we know about uncertainty?

Nicholas Bloom (Stanford University)

Stockholm, August 2023



Widespread view that uncertainty matters

_	DJIA 🔺 18437.	. 00 0.57%	S&P 500 ▲ 2149.10 0.45%	Nasdaq 🛦 5209.85 0.31%	U.S. 10 Yr 🔻 -31/32 Yield 1.969%	Crude Oil V 44.77 -0.47%	Euro 7 1.0943 -0.73%				
The Nove Hork Finner											
			The New York Times								
	<										
			At	the Fron	t Lines of th	e Inflation	า				
	f		Fight IIncortainty Raigns								
	Y		1 12	gni, Once	ertainty Neig	gns					
	AA		Central bankers and economists gathered and, amid concerns								
	*		about persistent inflation, wondered about all the things they still								
			don'	t know.							
			fft s	Share full article	16						
				M	acroeconomic	stabilisation	1				
				in	a volatile inflati	ion environr	ment				
				ECEFORUM	ECBFORUM STATE FORUM STATE CONFORMATION STATE	ECB FORUM COMMANDER ECB FORUM COMMANDER ECB FORUM COMMANDER					

I have been working on Uncertainty for >25 years (since my PhD)

Review of Economic Studies (2007) 74, 391–415 © 2007 The Review of Economic Studies Limited 0034-6527/07/00140391\$02.00

Uncertainty and Investment Dynamics

NICK BLOOM Stanford University, Centre for Economic Performance, and NBER STEPHEN BOND Institute for Fiscal Studies and University of Oxford



Contents lists available at ScienceDirect



journal homepage: www.elsevier.com/loc

Economic uncertainty before and during the COVID-19

Dave Altig ^a, Scott Baker ^b, Jose Maria Barrero ^c, Nicholas Bloom ^{d,*}, Philip Julia Leather ^g, Brent Meyer ^a, Emil Mihaylov ^a, Paul Mizen ^g, Nicholas P. Pawel Smietanka ^e, Gregory Thwaites ^g

^a Atlanta Federal Reserve Bank, United States of America ^b Northwestern University, United States of America ^c Instituto Tecnológico Autónomo de México, Mexico ^d Stanford University, United States of America ^e Bank of England, United Kingdom of Great Britain and Northern Ireland ^f University of Chicago, United States of America ^e University of Paris I, France

ARTICLE INFO

Article history: Received 7 June 2020 Received in revised form 25 August 2020 Accepted 26 August 2020 Available online 09 September 2020

Keywords: Forward-looking uncertainty measures Volatility COVID-19 Coronavirus

JEL classifications: D80 E22

ABSTRACT

We consider several economic uncertainty indicators for the Os and Os before and thum demic: implied stock market volatility, newspaper-based policy uncertainty, Twitter chatte certainty, subjective uncertainty about business growth, forecaster disagreement about fut model-based measure of macro uncertainty. Four results emerge. First, all indicators sh jumps in reaction to the pandemic and its economic fallout. Indeed, most indicators read on record. Second, peak amplitudes differ greatly - from a 35% rise for the model-based me uncertainty (relative to January 2020) to a 20-fold rise in forecaster disagreement about U paths also differ: Implied volatility rose rapidly from late February, peaked in mid-March March as stock prices began to recover. In contrast, broader measures of uncertainty pr plateaued, as job losses mounted, highlighting differences between Wall Street and Main St sures. Fourth, in Cholesky-identified VAR models fit to monthy U.S. data, a COVID-size ur shadows peak drops in industrial production of 12–19%. Crown Copyright © 2020 Published by Elsevier B Econometrica, Vol. 77, No. 3 (May, 2009), 623-685

THE IMPACT OF UNCERTAINTY SHOCKS

BY NICHOLAS BLOOM¹

Uncertainty appears to jump up after major shocks like the Cuban Missile crisis, the assassination of JFK, the OPEC I oil-price shock, and the 9/11 terrorist attacks. This paper offers a structural framework to analyze the impact of these uncertainty shocks. I build a model with a time-varying second moment which is numerically solved and



ncertainty is an amorphous concept. It reflects uncertainty in the minds of consumers, managers, and policymakers about possible futures. It is also a broad concept, including uncertainty over the path of macro phenomena like GDP growth, micro phenomena like the growth rate of firms, and noneconomic events like war and climate change. In this essay, I address four questions about uncertainty.

First, what are some facts and patterns about economic uncertainty? Both macro and micro uncertainty appear to rise sharply in recessions and fall in booms. Uncertainty also varies heavily across countries—developing countries appear to have about one-third more macro uncertainty than developed countries.

Second, why does uncertainty vary during business cycles? The types of exogenous shocks that can cause recessions—like wars, oil price jumps, and financial



Vol. 131 November 2016 Is

Issue 4

MEASURING ECONOMIC POLICY UNCERTAINTY*

SCOTT R. BAKER NICHOLAS BLOOM STEVEN J. DAVIS

We develop a new index of economic policy uncertainty (EPU) based on newspaper coverage frequency. Several types of evidence—including human readings of 12,000 newspaper articles—indicate that our index proxies for movements in policy-related economic uncertainty. Our U.S. index spikes near tight presidential elections, Gulf Wars I and II, the 9/11 attacks, the failure of Lehman Brothers, the 2011 debt ceiling dispute, and other major battles over fiscal policy. Using firm-level data, we find that policy uncertainty is associated with greater stock price volatility and reduced investment and employment in



JOURNAL OF THE ECONOMETRIC SOCIETY

An International Society for the Advancement of Economic Theory in its Relation to Statistics and Mathematics

http://www.econometricsociety.org/

Econometrica, Vol. 86, No. 3 (May, 2018), 1031-1065

REALLY UNCERTAIN BUSINESS CYCLES

NICHOLAS BLOOM Dept. of Economics, Stanford University

> MAX FLOETOTTO McKinsey & Company

NIR JAIMOVICH Dept. of Economics, University of Zurich

ITAY SAPORTA-EKSTEN

Uncertainty is hard to measure.....so I'll show four approaches



Measuring Uncertainty Across Time and Countries

- Financial Market Data

- Newspapers
- World Uncertainty Index
- Survey data



VIX, 1 month forward S&P500 implied vol: classic uncertainty measure



Pros: Daily (available real-time) back to 1990 **Cons**: Mainly recessions & financials crisis, few emerging/developing countries

Measuring Uncertainty Across Time and Countries

- Financial Market Data

- Newspapers

- World Uncertainty Index
- Survey data



Increasing use of Newspapers as another measure of uncertainty



Methodology **Research & Applications** About Us Home **Economic Policy Uncertainty Index** We develop indices of economic policy uncertainty for countries around the world. Monthly Global Economic Policy Uncertainty Index Zoom 1m 3m 6m 1y 7y All From: Jan 1, 1997 To: Jun 1, 2023 2005 2010 2015 2020 Highcharts.com 00000

www.policyuncertainty.com

This proxy for Economic Policy Uncertainty (EPU) comes from computer searches of newspapers

- US index: 10 major papers get monthly counts of articles with:
 - **E** {economic or economy}, and

P {regulation or deficit or federal reserve or congress or legislation or white house}, and

U {uncertain or uncertainty}

- Divide the count for each month by the count of all articles
- Normalize and sum 10 papers to get the U.S monthly index



US News-based economic policy uncertainty index



Source: "Measuring Economic Policy Uncertainty" by Scott R. Baker, Nicholas Bloom and Steven J. Davis, all data at <u>www.policyuncertainty.com</u>. Data normalized to 100 prior to 2010. Downloaded from <u>https://fred.stlouisfed.org/se</u> <u>ries/USEPUINDXD#0</u>

Can focus on areas of uncertainty, e.g. Health or Trade Policy



Notes: Weekly values for Economic Policy Uncertainty (EPU) index categories from www.policyuncertainty.com. See Baker, Bloom and Davis (2016) for details of EPU index construction. We plot data from 1 January 2015 to 30 July, with categories showing large rises in 2020 or 2019 plotted. Note that the average of the four plotted categories from 1985-2019 is as follows: Fiscal Policy=45.7, Health=17.7, Monetary Policy=27.1, and Trade Policy=5.7. This highlights how the rise in health policy in 2020 trade policy in 2019 are and particularly striking given their otherwise relatively low level.

Can also use the time series of newspapers to create a Historical EPU



and "war". Data normalized to 100 from 1900-2011.

UK Policy Uncertainty Index



Source: "Measuring Economic Policy Uncertainty" by Scott R. Baker, Nicholas Bloom and Steven J. Davis, all data at <u>www.policyuncertainty.com</u>. Data normalized to 100 prior to 2010. Downloaded from <u>https://fred.stlouisfed.org/se</u> <u>ries/USEPUINDXD#0</u>

Data from 11 UK papers

India Economic Policy Uncertainty Index



Source: "Measuring Economic Policy Uncertainty" by Scott R. Baker, Nicholas Bloom and Steven J. Davis, all data at <u>www.policyuncertainty.com</u>. Data normalized to 100 prior to 2010. Downloaded from <u>https://fred.stlouisfed.org/se</u> <u>ries/USEPUINDXD#0</u>

Data from 7 Indian papers

North Korean Economic Policy Uncertainty Index



Source: ??? Data from 0 North Korean newspapers

Pros: Monthly or Daily (real-time) back to 1900 Provides sub-categories (e.g. health, pandemic)

Cons: Newspaper bias? Only for countries with sufficient (free) press

Measuring Uncertainty Across Time and Countries

- Financial Market Data
- Newspapers
- World Uncertainty Index
- Survey data



The World Uncertainty Index covers 143 countries





Note: The WUI is computed by counting the percent of word "uncertain" (or its variant) in the Economist Intelligence Unit country reports. The WUI is then rescaled by multiplying by 1,000,000. A higher number means higher uncertainty and vice versa. For example, an index of 200 corresponds to the word uncertainty accounting for 0.02 percent of all words, which—given the EIU reports are on average about 10,000 words long—means about 2 words per report.

58 FINANCE & DEVELOPMENT | March 2020

www.worlduncertaintyindex.com

Uses Economist Intelligence Unit quarterly reports

EUI quarterly reports standard format, mean (and median) of 29 pages.

France			1		France			3		
1 1			•	1						
	2		France							
						14			France	
					The second s		The sub-second in			
					Domestic politics		expected, given			
		6		France			parliamentary el	8		France
						1	somewhat lower		wages (in part because of a rela	vation of the legislation on the 35-hour week) as
		Monetary policy	Having raised its refinancing rate eight times	by 25 basis points each since			US economy, the		well as tax cuts. A key facto	r preventing a stronger rebound in consumer
	Outlook for 20		December 2005, to 4% on June 6th 2007, the E	CB has since refrained from rate			and higher inflat		spending relates to French hot	useholds' increasing propensity to save. Despite
	o uno on tor at		increases. The ECB believes that monetary police side and that inflation risks remain However	cy is still on the accommodative		1	increase by only		as households increased savin	gs. Weak consumer confidence could weigh on
			turmoil is likely to mark a turning point. B	oth actual economic data and		1	government's tar		spending in the near term, alth	hough higher savings will provide a cushion for
			confidence indicators since the second quarter	of 2007 suggest that growth is		1	The outlook for o		spending later in the outlook 2008-09. French companies an	e facing a slowdown in external demand, with
			bring about a slowing of credit growth to hou	ischolds and firms. The euro is			statistics institute		relatively high debt levels and	sluggish profit growth. Borrowing costs will also
			expected to strengthen further against the	US dollar, which will reduce			(INSEE), showing		remain higher than in recent global financial markets persist	years (particularly if the recent uncertainty in s) Total domestic demand is expected to grow at
			ECB move is likely to be a cut in interest rates	and that this will occur in the			peak of -13 in		a lower rate than in 2007. Alth	hough this will cause import growth to slow in
			early part of 2008. After that, we expect the dec	eleration in euro area growth to			become more pe		2008, export growth is also exp	ected to be lower as a result of the stronger euro
			bottom out and the strengthening of the euro	o to come to an end. In these s interest rates on hold. In the			labour market. T		make a small negative contrib	ution to GDP growth in 2008, before becoming
			event of our risk scenario of a US recession an	d asset price falls occurring, the			government's la		more neutral in 2009.	
			ECB would reduce its rates more significantly.			1	measures to boo	Inflation	Inflation (FU harmonised me	essure) rose to 2.1% in October from 1.6% in
			Economic forecast			1	tax-free access to measure was into		September, partly as a result	of base effects. However, inflation in France
			Economic forecast				diverted to other		remains significantly lower that	n the euro zone average (2.6%), and the outlook
		International assumptions	International assumptions summary (% unless otherwise indicated)			Industrial prospects	The index of in-		inflation to increase to 2.1% i	n 2008, as higher energy and food costs feed
			20	06 2007 2008 2009		industrial prospects	after remaining s		through to the headline rate. In	flation is expected to fall back to 1.8% in 2009, as
	Monthly r		Real GDP growth World	5.3 5.1 4.6 4.7			sector, where ou		base effects become more favou comes from the labour market	rable. A possible risk to the outlook for inflation Recent declines in unemployment have yet to
			OECD	3.1 2.6 1.8 2.5		1	slowdown in h		lead to a pick-up in wage	growth, but surveys suggest that consumers'
			EU27 Exchange rates	3.0 2.8 2.1 2.2			registered a decli		perception of inflation is mu	uch higher than actual inflation. Should this
			¥:US\$ 11	6.2 118.0 107.3 96.3			INSEE's latest		perception persist, pay claims e	our pre up.
			SDR:US\$ 0.0	580 0.652 0.625 0.646	International relations		investment in b	Exchange rates	The euro appreciated steadily	against the US dollar during 2006 and the first
			Financial indicators ¥ 3-month reno rate 0	28 0.62 0.88 1.81	international relations	1	estimated increas		growth prospects for 2008 we	akened and the US Federal Reserve (the central
			US\$ 3-month commercial paper rate 5	.03 5.16 4.55 4.73			to be greatest am		bank) cut official interest rates	by 50 basis points. Given recent turmoil in the
1000			Commodity prices Oil (Brent; US\$/b) 6	5.3 73.3 78.0 72.0		1	sector, business predicting an inc		financial markets, the euro's ex remain volatile in the coming	change rate against the US dollar is expected to months. The annual average rate is projected to
Editorial			Gold (US\$/troy oz) 60	4.5 696.7 822.5 706.3			. 0		appreciate from US\$1.26:€1 in	2006 to US\$1.37:€1 in 2007 and US\$1.46:€1 in
			terms) 1	6.1 26.7 7.9 -0.9		Prices and employment	Consumer price		2008. However, we expect that	it as a result of confidence in the US economy
			Industrial raw materials (% change in US\$ terms) 4	9.6 12.8 -3.1 -12.8			quarter as a who		to US\$1.33:€1 on average in 20	09. There is, however, a risk of a much sharper
Monthly Report December 2007			The second encourse continued to encoure determined	power parity exchange rates.		a	in prices in Octo		and more lasting fall in the US	dollar against the euro.
			growth is likely to have cooled slightly since	mid-year. This will continue in			inflation (exclud	External sector	The trade balance, which has	deteriorated sharply in recent years, will remain
			2008, before growth picks up a little in 2009.	World GDP growth measured at	Monthly Report December 2007	_	2005, but it rei		in deficit in 2007-09, as the s	trength of the euro's exchange rate weighs on
			in 2008, before moving back up to 3.4% in 20	orecast at 3.7% in 2007 and 3.1%			October, up from		France's trade competitiveness current account in the red, but	The deficit on visible trade will maintain the the external deficit should remain manageable
			purchasing power parity (PPP) will be slight	y less marked because of the					as a share of GDP, as a result o	f large surpluses on the services and investment
	Monthly Report December 2007		greater relative weight that PPP gives to devel will remain strong The slowdown reflects a st	oping countries, where growth		Monthly Report December 2007			income accounts.	
			2.9% in 2006 to 1.9% in 2007 and 1.5% in 2008, a	nd a more moderate slowdown						
			in the euro area to an estimated 2.6% in 2007 an	d around 2% in 2008-09.						
				The Free resident shall be a set to be the set of the set				Monthly Report December 2007	www.eiu.com	© The Economist Intelligence Unit Limited 2007
		Hontrity Report December 2007	www.eu.com «D	The aconomist Intelligence Unit Limited 2007						

Construction of the World Uncertainty Index from EIU Reports

EIU very standardized process

- Field experts prepare a draft and send it to country experts at headquarters.
- Regional editor to integrate with their own and EIU broader inputs
- Senior editor checks draft to align with overall EIU tone and approach

Pros

- Comparable across countries with a standard process
- Written by country experts for informed professionals

Cons

- Only one EIU report per country per quarter, so limited body of text (noisy)
- Only available quarterly with about 1 month lag

Pro Example China: WUI shows Cultural Revolution (not news EPU)



Fact 1: Global uncertainty has been rising....

World Uncertainty Index (WUI): Global

Index. GDP weighted average. 1990Q1 to 2023Q2

Print Excel Copy



Source: https://worlduncertaintyindex.com/

....including rising in Sweden



Thanks to Bo Becker for the slide using data from www.worlduncertaintyindex.com

Fact 2: The sources of uncertainty change continuously



Source: https://worlduncertaintyindex.com/ Note only highlighted sources included (so does not add to the overall index)

Fact 3: Uncertainty higher in developing economies

Average World Uncertainty Index (WUI) by income group



Source: https://worlduncertaintyindex.com/

25

Fact 4: Country source of global uncertainty varies – e.g. from the US



Source: Share of all uncertainty words with US focused word in the same sentence <u>https://worlduncertaintyindex.com/</u> (e.g. USA, Obama, White House etc)

Share of Global Uncertainty from the UK



Share of Global Uncertainty from Russia



Source: Share of all uncertainty words with Russian focused word in the same sentence https://worlduncertaintyindex.com/ (e.g. Russia, Ukraine etc)

Measuring Uncertainty Across Time and Countries

- Financial Market Data
- Newspapers
- World Uncertainty Index

- Survey data



Running a large UK monthly survey of 3,000 firms

%

10

Decision Maker Panel

Decision Maker Panel





Looking a year ahead from the third quarter of 2020 to the third quarter of 2021, by what % amount do you expect your SALES REVENUE to have <u>changed</u> in each of the following scenarios?

Notes:

a) Please include sales of UK-based businesses only and not from any overseas part of the group.b) Sales growth scenarios should be ordered from the lowest to the highest.

The LOWEST % change in sales revenue would be about:

A LOW % change in sales revenue would be about:

A MIDDLE % change in sales revenue would be about:

A HIGH % change in sales revenue would be about:

The HIGHEST % change in sales revenue would be about:

Please assign a percentage likelihood (probability) to the % <u>changes</u> in SALES REVENUE you entered (values should sum to 100%)

LOWEST: The likelihood of realising about 0% would be:	15	%
LOW: The likelihood of realising about 3% would be:	25	%
MIDDLE: The likelihood of realising about 5% would be:	30	%
HIGH: The likelihood of realising about 7% would be:	20	%
HIGHEST: The likelihood of realising about 10% would be:	10	%
Total	100	%





81% respondents are CFO/CEOs, and 14% are financial managers

Percentage of respondents



Similar Monthly US survey on 500 firms with the Atlanta Fed

Key questions on sales as follows

Looking ahead, from now to four quarters from now, what	
approximate percentage sales revenue growth rate would you	
assign to each of the following scenarios?	

The LOWEST percentage sales revenue growth rate would be about: -10 %	
A LOW percentage sales revenue growth rate would be about: 0 %	
A MIDDLE percentage sales revenue growth rate would be about: 3 %	
A HIGH percentage sales revenue growth rate would be about: 8 %	
The HIGHEST percentage sales revenue growth rate would be about: 16 %	

 Please assign a percentage likelihood to the sales revenue growth rates you entered. (Values should sum to 100%)

 LOWEST: The likelihood of realizing a -10% sales revenue growth rate would be:

 LOW: The likelihood of realizing a 0% sales revenue growth rate would be:

 MIDDLE: The likelihood of realizing a 3% sales revenue growth rate would be:

 HIGH: The likelihood of realizing a 8% sales revenue growth rate would be:

 HIGHEST: The likelihood of realizing a 16% sales revenue growth rate would be:

 10

 Total





Averaging across firms reveals upside and downside risks (US data)



Source: Survey of Business Uncertainty conducted by the Federal Reserve Bank of Atlanta, Stanford University, and the University of Chicago Booth School of Business. For more information, see "<u>Surveying Business Uncertainty</u>"

Uncertainty in sales and hiring has fallen back post COVID (US data)

Hiring uncertainty

Source: Survey of Business Uncertainty conducted by the Federal Reserve Bank of Atlanta, Stanford University, and the University of Chicago Booth School of Business. For more information, see "Surveying Business Uncertainty"

Since 2022 a major lingering uncertainty from inflation (prices)

Source: <u>www.decisionmakerpanel.com</u> conducted by the Bank of England, Nottingham University and Stanford University.

What about future uncertainty shocks?

The "Anna Karenina" theory of uncertainty

Certain times are all alike; each uncertainty shock is uncertain in its own way

So what to do – three tips from our recent HBR article

- 1. Follow domestic & global economics and politics
- 2. Pay for flexibility (e.g. lease vs buy)
- 3. Use contingency planning

Post slides on Linked-In, all research papers on my website

Back-Up Slides

Can also measure types of uncertainty: e.g. Trade Uncertainty

World Trade Uncertainty Index over time

Note: The WTUI index is computed by counting the number of times uncertain (or the variant) is near the following words: protectionism, North American Free Trade Agreement (NAFTA), tariff. trade. United Nations Conference on Trade and Development (UNCTAD) and Trade Organization World (WTO) in EIU country reports. The WTUI is then normalized by total number of words and rescaled by multiplying by 1,000. For the list of countries included in the index. see Table 1. Period covered is 1996Q1 to 2023Q2.

Measuring types of uncertainty – e.g. Pandemic Uncertainty

World Pandemic Uncertainty Index over time,

Uncertainty shocks are followed by large economic contractions

GDP response to WUI innovations—annual data

Note: VAR fit to annual data for a panel of 143 countries from 1952 to 2020. Impulse responses of GDP to a one-standard deviation increase in the WUI—equal to the change in average value in the index from 2014 to 2016—based on a Cholesky decomposition with the following order: the WUI and GDP growth. The specification includes two lags of all variables. Country and time fixed effects are included.

GDP response to WUI innovations—IV exogenous elections

Note: VAR fit to quarterly data for an unbalanced panel of 49 countries from 1970q1 to 2020q4. Impulse responses of GDP to a one-standard deviation increase in WUI—equal to the change in average value in the index from 2014 to 2016—using as instrument exogenous elections and based on a Cholesky decomposition with the following order: exogenous elections, the log of average stock return, the WUI and GDP growth. The specification includes four lags of all variables. Country and time fixed effects are included. First stage: $WIII_{res} = 0.185 \pm 0.099 Exogenous elections$

$$UI_{i,t} = 0.185 + 0.099Exogenous election$$

t-statistics in parenthesis.

Effects of uncertainty larger with weaker rule-of-law

Below-median rule of law

Above-median rule of law 1 2 3 4

Note: Response estimated using the local projection method (Jorda 2005) : $y_{i,t+k} - y_{i,t-1} = \alpha_i + \gamma_t + \beta^l D_i W U I_{i,t} + \beta^h (1 - D_i) W U I_{i,t} + \theta' X_{i,t} + \varepsilon_{i,t}$