# Navigating through Uncertainty: Firm Behaviors and Macroeconomic Outcomes

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BOT Symposium 2020



PUEY UNGPHAKORN INSTITUTE FOR ECONOMIC RESEARCH



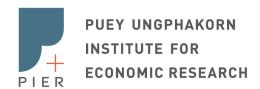
### Uncertainties Abound





### What We Do

- 1. Measurement and analysis of different types of uncertainty
- 2. Macroeconomic impacts of uncertainties
- 3. Firm-level investment, revenue growth and trade responses to uncertainties
- 4. Policy implications and recommendations



# How to Measure Uncertainty?





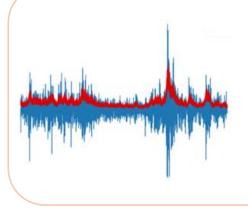
#### 1. Market-based

- USTHB fx option implied volatility
- SET historical volatility



### 2. Survey-based

- Consumer confidence index
- Business sentiment index



#### 3. Model-based

 Apply FAVAR model with stochastic volatility to 200+ macroeconomic and financial time series



#### 4. Text-based

 Apply Boolean search, topic modeling (LDA) to articles in 4 Thai language newspapers

#### 5. Broad-based





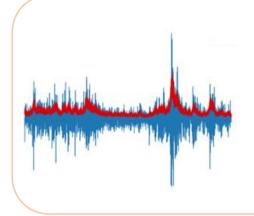
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Crour	1: National Account Data (Quarterly Series)	Grou	p 4: Housing (Monthly Series)			-	
1	Real Gross Domestic Product	58	Fee: Juristic Act and Right Registration Fee for Immovable Property (Millions of Baht)	118	MRR: minimum retail rate (Min)		up 9: Stock Market Indices (Monthly Series)
2	Consumption	59	Land licen: Land Development Licences - Bangkok Metropolis	119 120	MRR: minimum retail rate (Max) Government bonds (Total)	184	SET index: Stock Exchange of Thailand Index
3	Government Consumption	60	Construction Area: Construction Areas Permitted (1000 sqm.)	121	Treasury bills (Total)	185	SET Food Index
4	Investment	61	Land Trans: Land and building Transactions Nationwide (Millions of Baht)	122	Promissory notes (Total)	186	SET Bank Index
5	Exports of goods and services	62	building licen: Building license	123	State enterprise bonds (total)	187	SET Energy Index
6	Imports of goods and services	63	bld licen-bkk: Building license in Bangkok	124	BOT-bond : Bank of Thailand bonds	188	SET 50: SET 50 Index
Group	2: Output and Income (Monthly Series)	64	bld licen-others: Building license in other provinces	125	Government debt securities held by nonfinancial market mutual funds	Grou	up 10: Trade (Monthly Series)
7	PI:Personal Income	65	New hous: New Housing Project in Bangkok Metropolis and Vicinity (unit)	126	Outstanding government debt security	189	Ex-volume: Export volume
8	MPI: Manufacturing Production Index	66	housing proj: New Housing in Bangkok Metropolis and Vicinity (unit)	127	Total deposits outstanding of Commercial Banks	190	Im-volume: Import volume
9	MPI_10: Manufacture of food products	67	apartment: New apartment in Bangkok Metropolis and Vicinity (unit)	128	Deposits turnover ratio of Commercial Banks	191	Im-cons: Import - Consumer Goods: Volume
10	MPI_12: Manufacture of tobacco products	68	self built housing: New selfbuilt housing in Bangkok Metropolis and Vicinity	129	Government bonds Short-term 1 year	192	Im-rawmat: Import - Raw Materials: Volume
11	MPI_13: Manufacture of textiles		(unit)	130	Government bonds Medium-term 1-5 years	193	Im-cap: Import - Capital Goods: Volume
12	MPI_14: Manufacture of wearing apparel	69	credit outstanding: Property Credit Outstanding (Millions of Baht)	131	Government bonds Long-term 5 year up	194	Ex-agri: Export - Agricultural Products: Volume
13	MPI_15: Manufacture of leather and related products	70	re credit: Real Estate Development Credit	132 133	Government promissory notes State enterprise bonds Short-term 1 year	195	Ex-fish: Export - Fishery Products: Volume
14	MPI_19: Manufacture of coke and refined petroleum products	71	personal housing credit:Personal Housing Credit	134	State enterprise bonds Short-term 1 year State enterprise bonds Medium-term 1-5 years	196	Ex-mfgs: Export - mfgs: Volume
15	MPI_20: Manufacture of chemicals and chemical products		p 5: Consumption, Orders, and Inventories (Monthly Series)	135	State enterprise bonds Incuminated in 1-5 years State enterprise bonds Long-term 5 year up	197	Import goods excluding gold
16	MPI_22: Manufacture of rubber and plastic products	72	bsi: Business survey index	136	State enterprise promissory notes Short-term 1 year	198	Occupancy Rate
17	MPI_23: Manufacture of other non-metallic mineral products	73	bsi_perf: Business survey index Performance	137	New issuances of domestic securities	199	Tourists
18	MPI_24: Manufacture of basic metals	74 75	bsi_order: Business survey index Total Order Book bsi_invest: Business survey index Investment	138	New issuances of domestic public sector securities		up 11: Financial Variables (Monthly Series)
19	MPI_25: Manufacture of fabricated metal products, except machiner	76	bsi_employment: Business survey index Employment	139	New issuances of domestic private sector securities	200	D_log(DIV): Dividend series based on
	equipment	77	bsi_cost: Business survey index Production Costs (Invert)	140	Authorized Capital of Newly Registered Companies	201	D_log(P): Price series based on
20	MPI_26: Manufacture of computer and electronic products	78	bsi_3 month: Expected Business survey index over 3 month horizon		p 7: Bonds and Exchange Rate Measures (Monthly Series)	202	D_DivReinvest: Dividend under reinvestment based
21	MPI_29: Manufacture of motor vehicles, trailers and semi-trailers	79	Retail Sales Index	141	NEER: Nominal effective exchange rate	203	D_Preinvest: Price under reinvestment based on
22	CAPU_10: Capital utilization of food products	80	Retail: Motor: Retail sales of motor vehicles and automotive fuel	142	REER: Real effective exchange rate	203	d-p: Dividend to price ratio based on
23	CAPU_13: Capital utilization of textiles	81	Retail: Nondu: Retail sales of non-durable goods	143	inter_overnight: Interbank overnight lending rates		AutoReturn: Automotive industry portfolio
24 25	CAPU_14: Capital utilization of wearing apparel	82	Retail: Du: Retail sales of durable goods	144	repo_1day: Bilateral repurchase rate (1 day)	205	
26	CAPU_15: Capital utilization of leather and related products CAPU_17: Capital utilization of paper and paper products	83	Retail: Store: Retail sales of department stores, supermarkets, and general	145	repo_7days: Bilateral repurchase rate (7 days)	206	FoodReturn: Food industry portfolio
27	CAPU_19: Capital utilization of coke and refined petroleum product		stores	146 147	repo_14days: Bilateral repurchase rate (14 days) Thai Baht implied interest rate (1 month)	207	FashionReturn: Fashion industry portfolio
28	CAPU_20: Capital utilization of chemicals and chemical products	84	Wholesales Index	148	Thai Baht implied interest rate (1 month)  Thai Baht implied interest rate (3 months)	208	HomeReturn: Home industry portfolio
29	CAPU_22: Capital utilization of rubber and plastic products	85	whole sale: non du: Wholesales of non-durable goods	149	Thai Baht implied interest rate (5 months)  Thai Baht implied interest rate (6 months)	209	PersonReturn: Personal goods industry portfolio
30	CAPU_23: Capital utilization of other non-metallic mineral products	86	whole sale: du: Wholesales of durable goods	150	tThai Baht implied interest rate (12 months)	210	FinanceReturn: Finance industry portfolio
31	CAPU_24: Capital utilization of basic metals	87	whole sale: int : Wholesales of intermediate goods	151	Government bond yield (1 year)	211	InsuranceReturn: Insurance industry portfolio
	CAPU_25: Capital utilization of fabricated metal products, except	88	VAT - Gross Value Added Tax at 2000 prices (Million baht)	152	Government bond yield (2 years)	212	PetroReturn: Petroleum industry portfolio
32	machinery and equipment	89	Sales: Automotives: Domestic automobiles sales	153	Government bond yield (3 years)	213	PKGReturn: Packaging industry portfolio
33	CAPU_26: Capital utilization of computer and electronic products	90 91	Sales: Clothes: Retail sale of clothing, footware and leather articles Sales: Food: Retail sale of food in specialized store	154	Government bond yield (5 years)	214	PropertyReturn: Property industry portfolio
34	CAPU_29: Capital utilization of motor vehicles, trailers and semi-tra	91	Sales: Food: Retail sale of lood in specialized store Sales: Bev: Retail sale of beverages in specialized store	155	Government bond yield (7 years)	215	ENERGReturn: Energy industry portfolio
Group	3: Labor Markets (Monthly Series)	93	Sales: Tobacco: Retail sale of tobacco products in specialized stores	156	Government bond yield (10 years)	216	CommReturn: Commerce industry portfolio
35	Help Wanted		Sales: Electronics appliances: Retail sale of electrical household appliances	157	Government bond yield (12 years)	217	HELTHReturn : Healthcare industry portfolio
36	Help wanted/unemp	94	in specialized stores	158	Government bond yield (14 years) p 8: Prices (Monthly Series)	218	MEDIAReturn : Media industry portfolio
37	Emp (Total): Employed Total (Thousand)	95	PII: Private Investment Index	159	CPI : Consumer price index	219	TourismReturn: Toursim industry portfolio
38	Emp_nonag: Civilian Labor Force: Employed, Nonagricultural Indus	96	Sales: Construction: Construction material sales index	160	CPI-food: Consumer price index food and non-alcoholic beverages	220	TranReturn: Transportation industry portfolio
39	Unemployment Rate: Unemployment Rate: All workers	97	Import: Capital: Imports of capital goods at 2010 prices	161	CPI-apparel: Consumer price index apparel and foodwear	221	ETRONReturn: Electronics industry portfolio
40	U_dr1m: Unemployment with duration less than 1 month	98	Sales: Machine: Domestic machinery sales at 2010 prices	162	CPI-housing: Consumer price index apparer and foodwear CPI-housing: Consumer price index housing and furnishing		
41	U_dr3m : Unemployment with duration between 1-2.9 months	99	PCI : Personal Consumption Index	163	CPI-med: Consumer price index medical and personal care		
42	U_dr6m: Unemployment with duration between 3-5.9 months	100	Sales: Passenger Cars: Sales of passenger cars (units)	164	CPI-trans: Consumer price index transportation and communication		
43	U_dr9m: Unemployment with duration between 6-8.9 months	101	Sales: Motorcycle Sales: Sales of motorcycles (units)	165	CPI-recre: Consumer price index recreation and education		
44	U_dr12m: Unemployment with duration between 9-11.9 months	102	Sales: Commercial Cars: Sales of commercial cars (units)	166	CPI-tobacco: Consumer price index tobacco and alcoholic beverages		
45	U_drmore12m: Unemployment with duration more than 1 year	103	Gas Index: Sales of benzene, gasohol and diesel index	167	CPI-rawfood: Consumer price index raw food		
46	Emp total-agri :Total employment in agricultural sector	104 105	Electricity: Household electricity consumption index	168	CPI-energy: Consumer price index energy		
47	Emp privatemanu: Private employment in manufacturing sector	106	Import: Clothes: Import of textiles index Domestic Car Sales: Domestic automobiles sales (units)	169	CPI-ex food energy: Consumer price index excluding food and energy		
48	Emp total-cons:Total employment in construction		p 6: Money and Credit (Monthly Series)	170	CPI-ex food energy rent: Consumer price index excluding energy and r	ent	
49 50	Emp total_trade: Total Employment in Trade Emp total_hotelrest:Total employment in hotel and restaurants		M1: Narrow money	171 172	PPI : Producer price index PPLagri: Producer price index agricultural products		
51	Emp total_noterest: Total employment in noter and restaurants Emp private-fin:Private employments in financial sector	108	M2: Broad money	173	PPL mining: Producer price index mining products		
52	Private avg hour: Average working hours per weeks of private emplo	109	Currency: Currency held by the public	174	PPLmanu: Producer price index manufactured products		
53	Private earn_hr: Average earning per hour of private employees	110	Banknotes in Circulation	175	price_cons: Price of construction materials index		
	Avg hr-private manu: Average working hours per weeks of private	111	Deposit	176	price_wood: Price of construction materials_wood		
54	manufacturing workers	112	Narrow Money	177	price_cement: Price of manufacturing goods_mixed cement 50 kgs.		
55	Avg wage-trade: Average earning per hour for private trade workers	113	Currency Held by Depository Corp Commercial Banks	178	price_metal: Price of construction materials_metal		
56	Avg wage-frade. Average earning per hour for private financial worker	114	Transferable Deposits at Depository Corp Commercial Banks	179	price_diesel: Price of manufacturing goods_diesel		
	Avg wage-manu: Average earning per hour for private manufacturing	115	Quasi-money	180	price_fueloil: Price of manufacturing goods_fuel oil		
57	workers	116	MLR: minimum loan rate (Min)	181	price_sugar: Price of manufacturing goods_white sugar (1 kg.)		
		117	MLR minimum loan rate (Max)	182	price_rice: Wholesale price of 100% rice in Bangkok Metropolis		7
				183	price_rubber: Wholesale price of ribbed smoked sheet rubber in Bangko	OK	
					Metropolis		





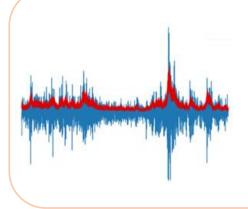
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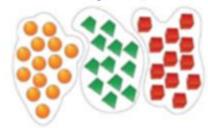




# **Article Count**



### **Topics**



### Text-Based Method







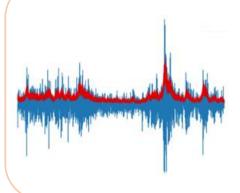
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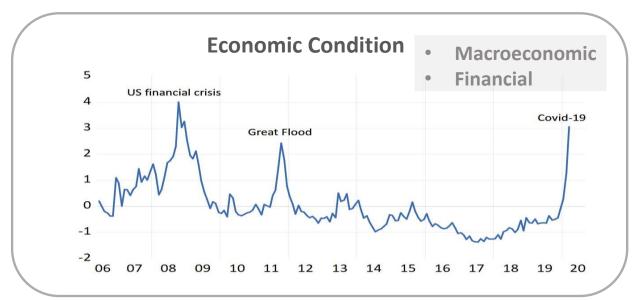


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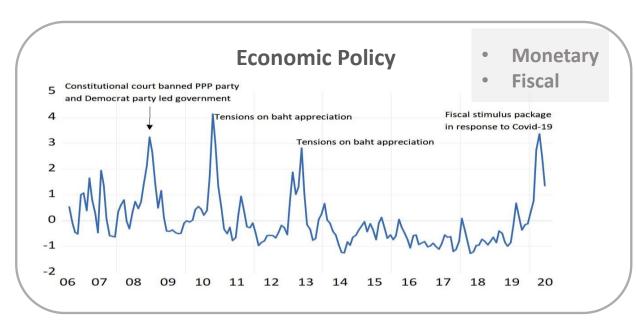




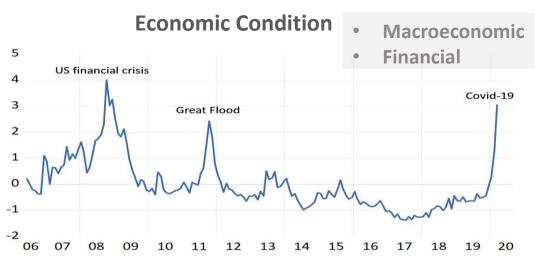


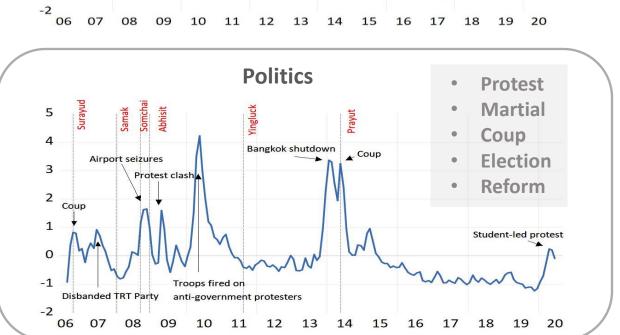
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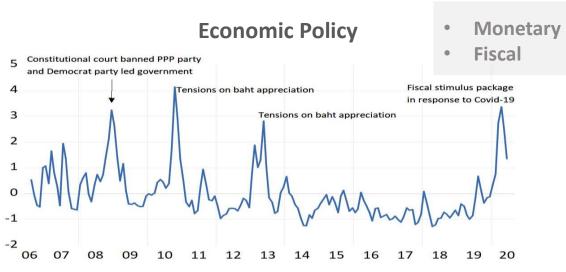
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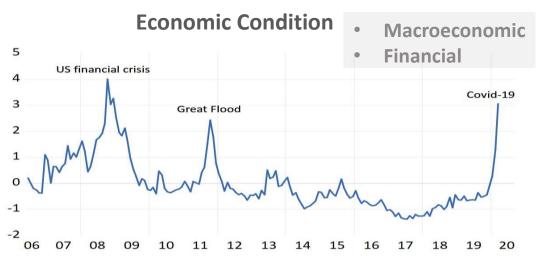


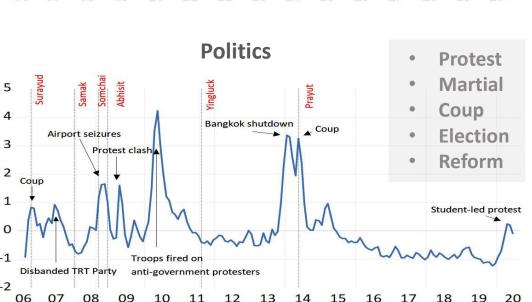


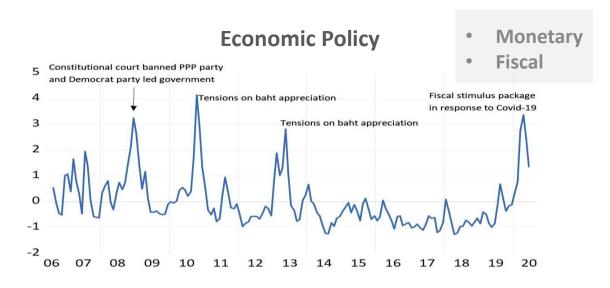


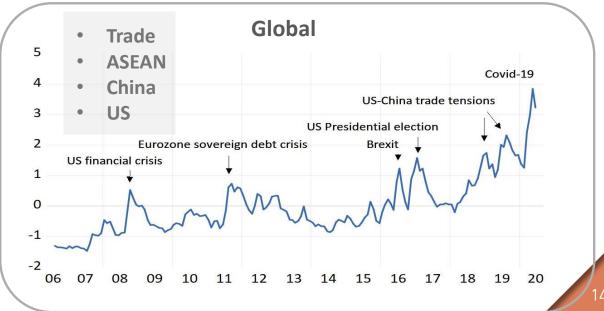




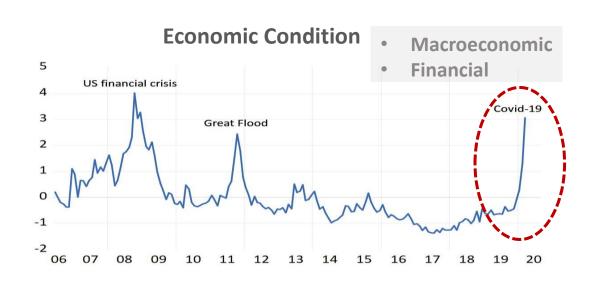


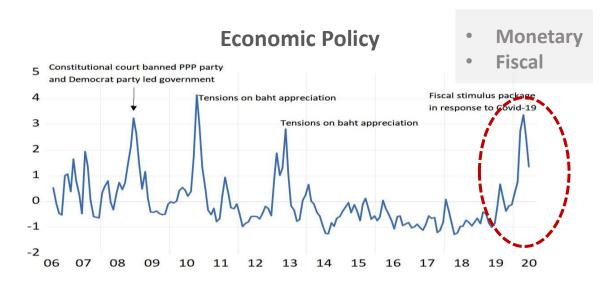


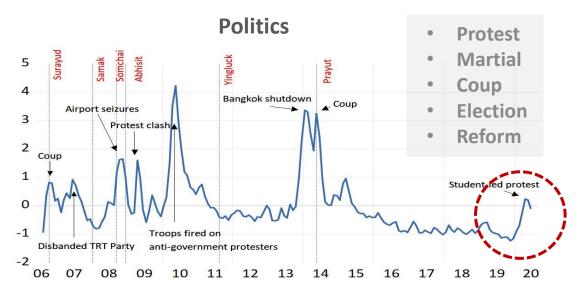


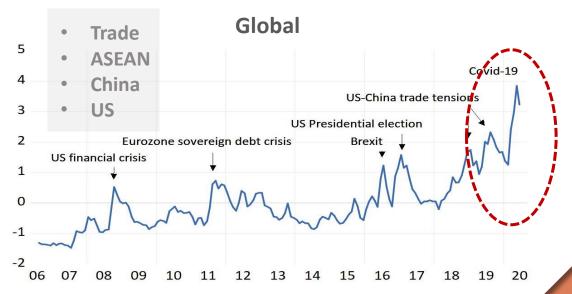






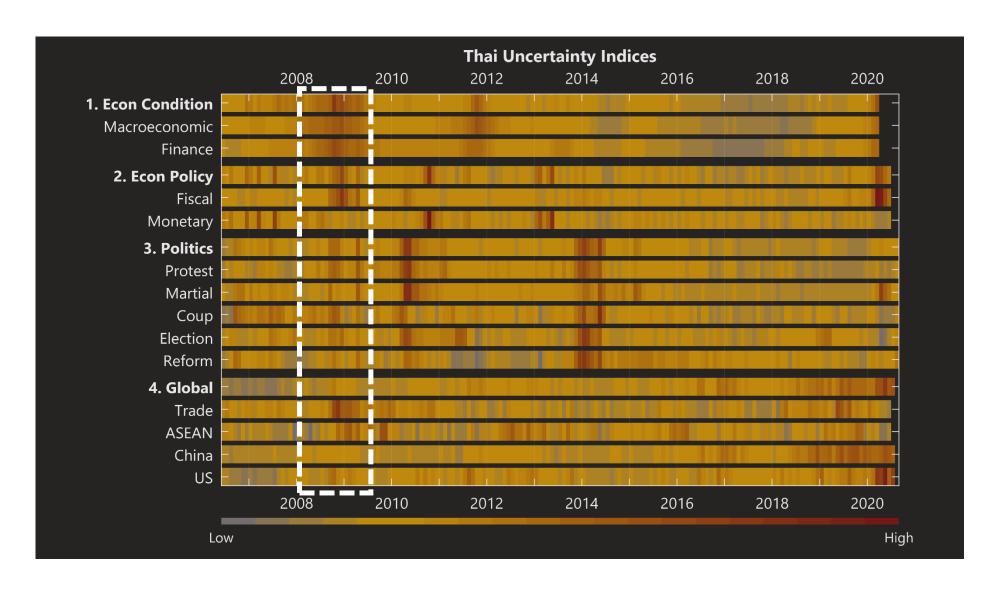






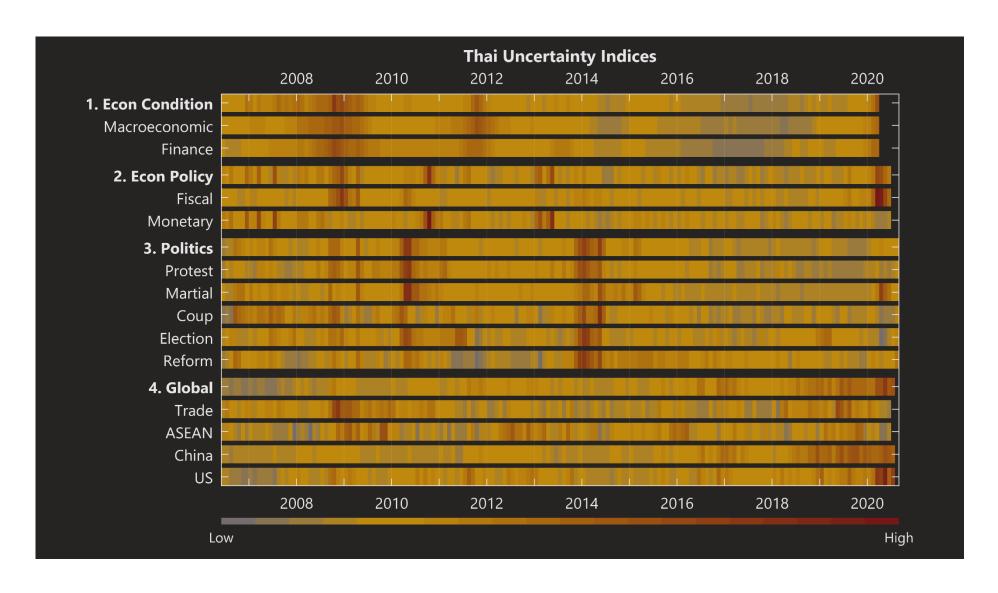


### Of Different Species





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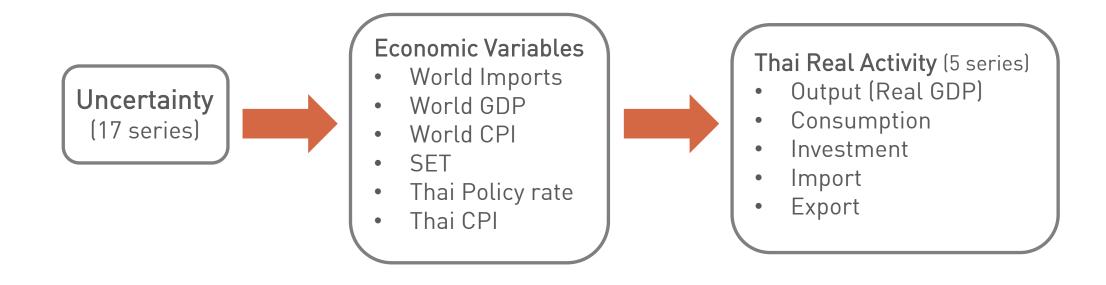




# Macroeconomic Impacts of Uncertainty Shocks

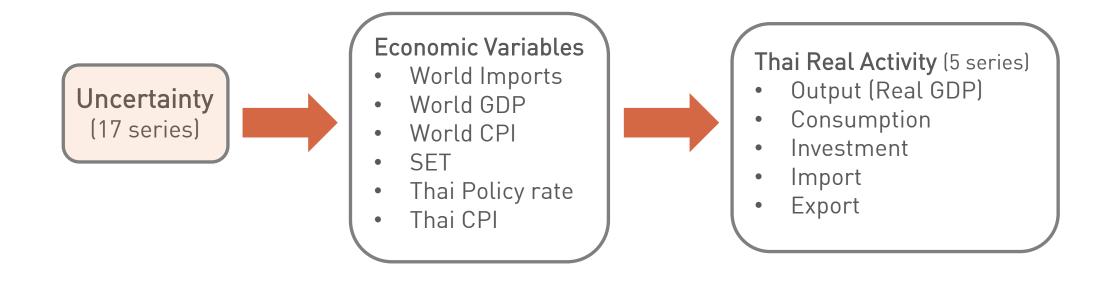


Estimate 85 Structural Vector Autoregressive Models (SVARs)



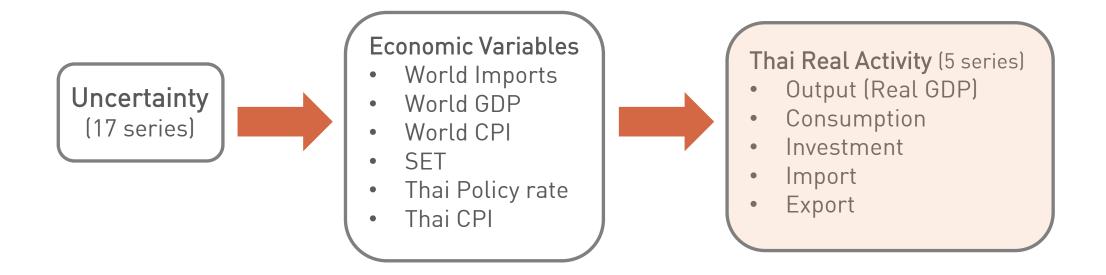


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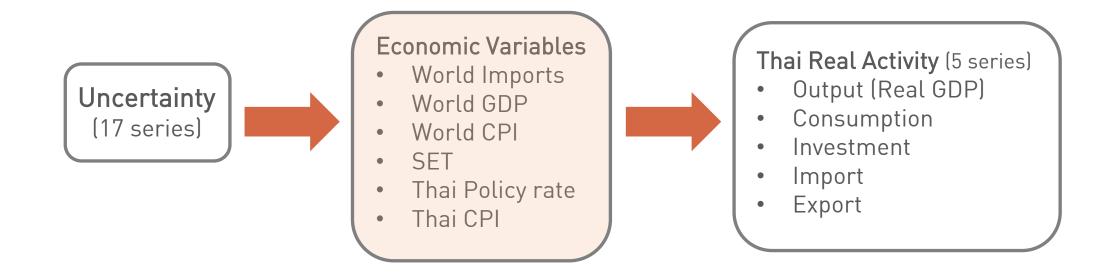


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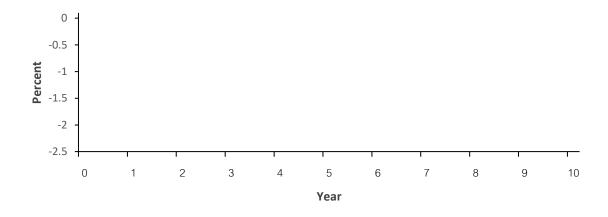




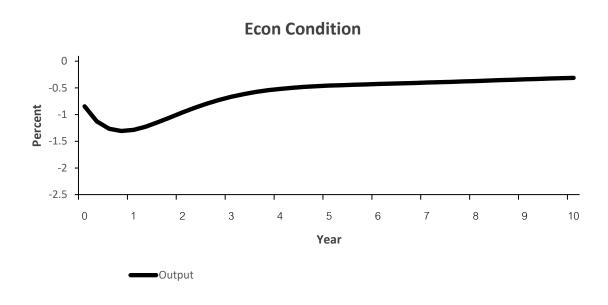
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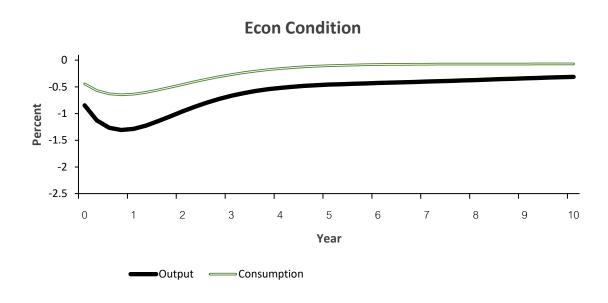


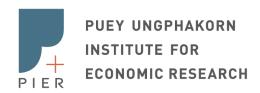


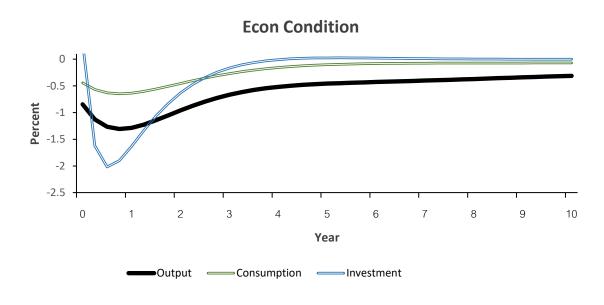




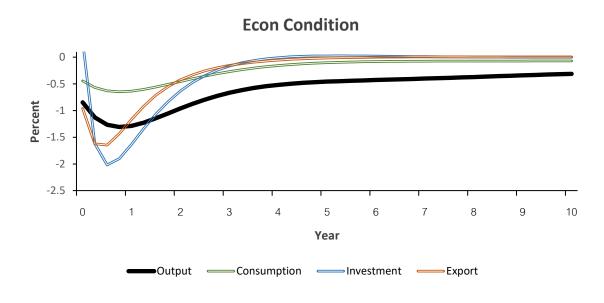




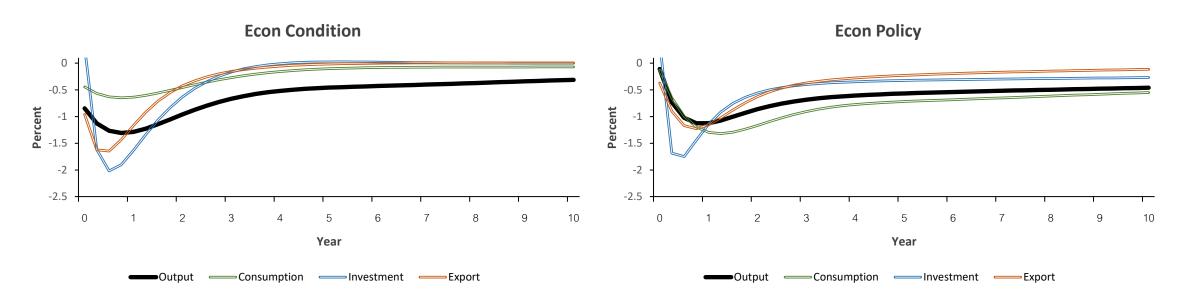




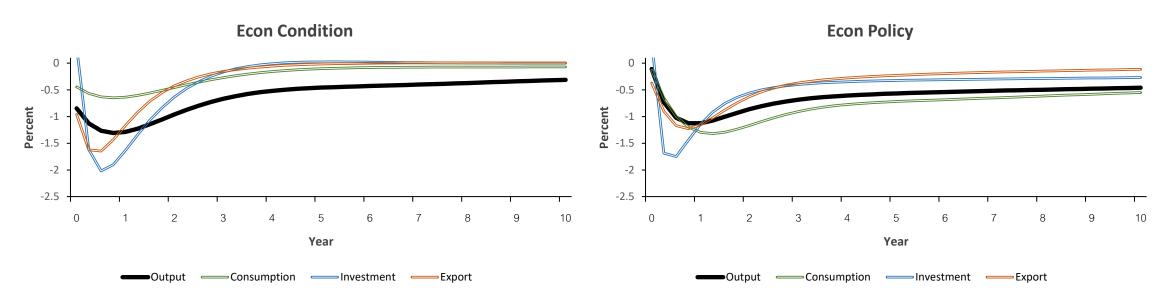


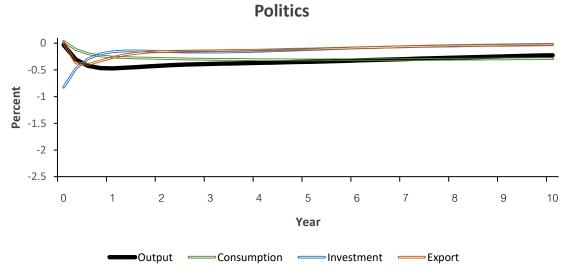




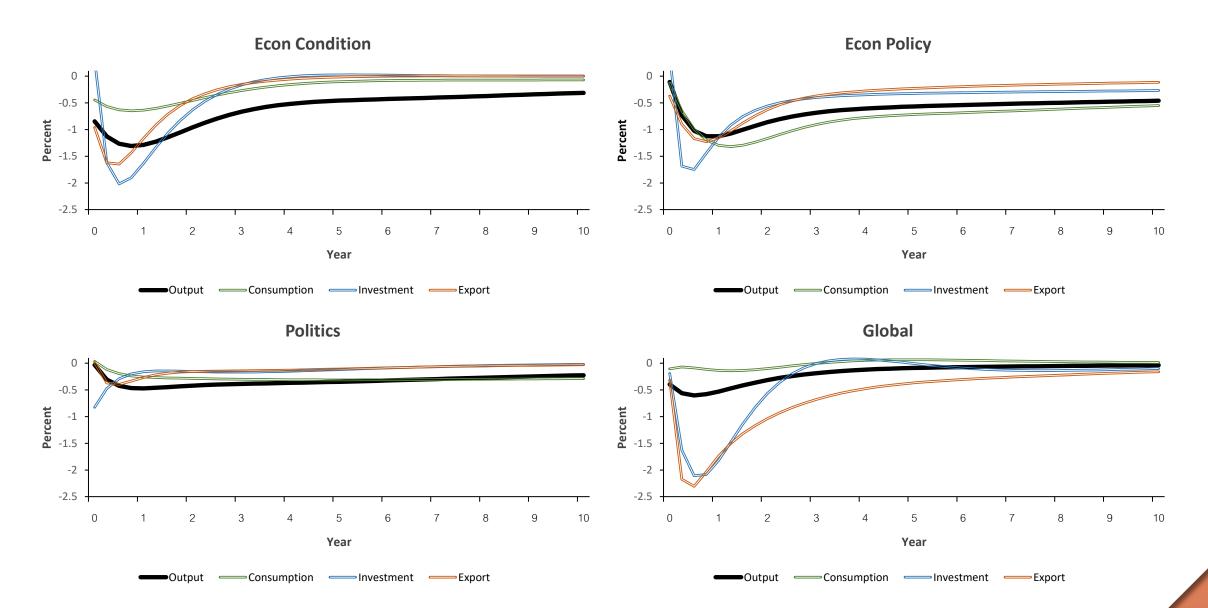






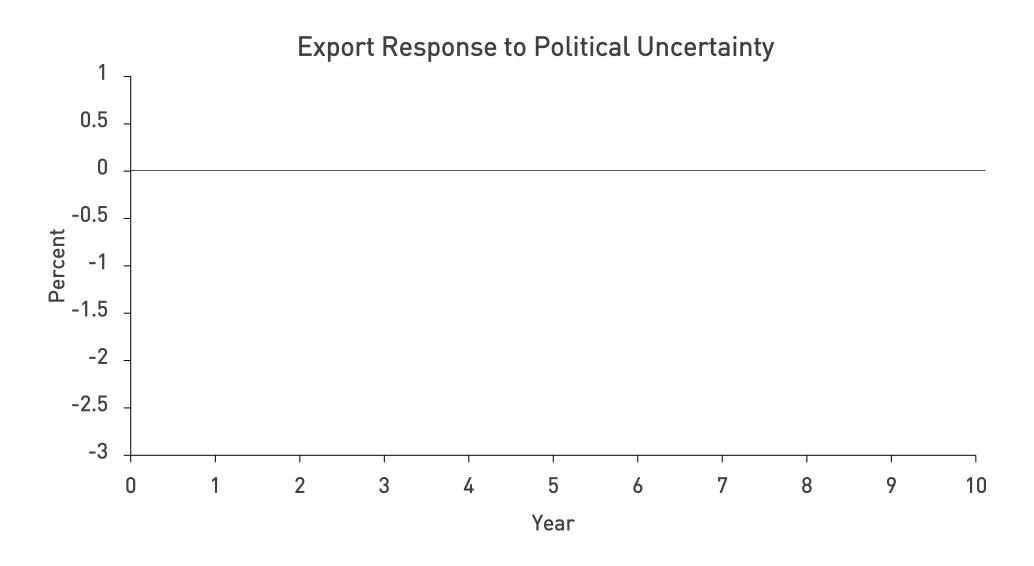






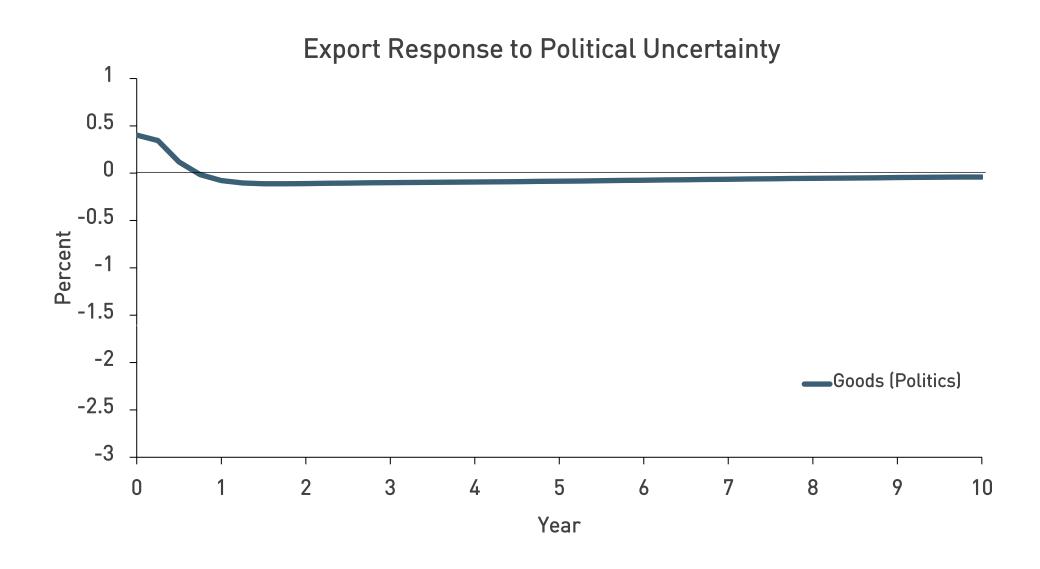


### Differences in Direction



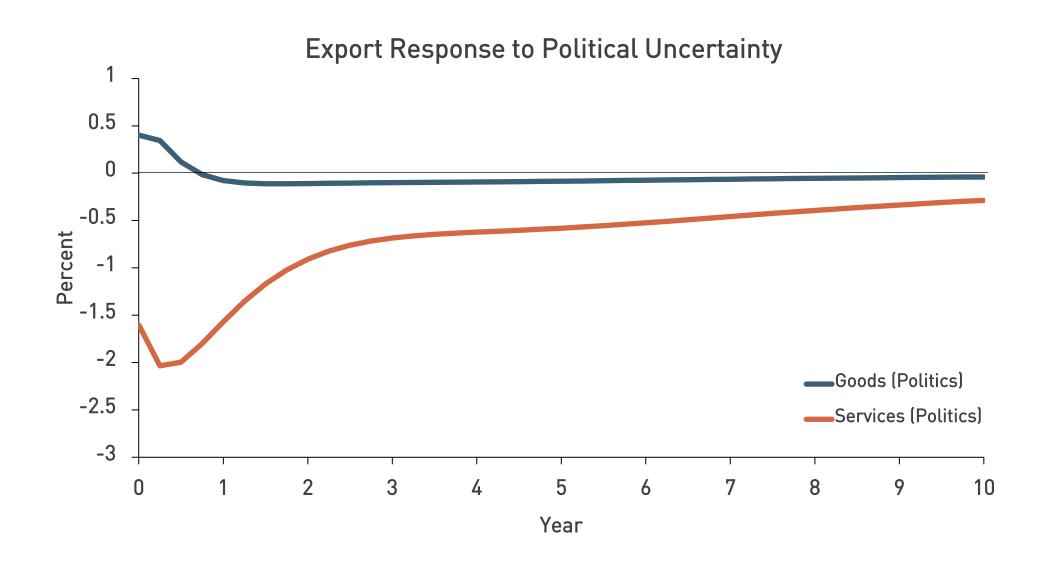


### Differences in Direction





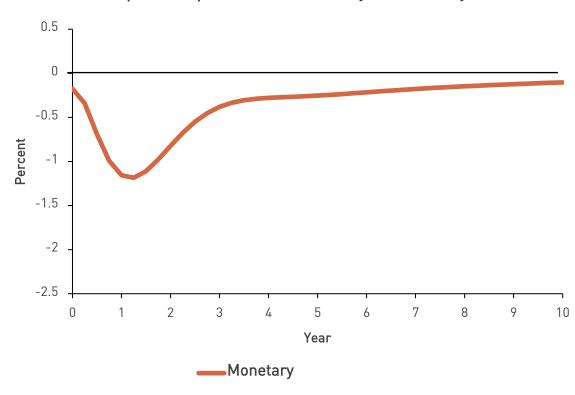
### Differences in Direction





### Differences in Persistence

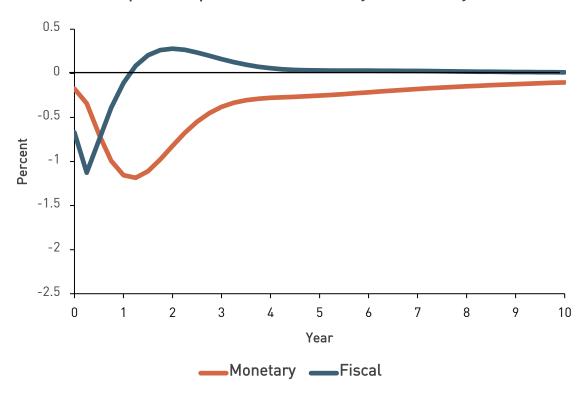
#### **Export Response to Econ Policy Uncertainty**





### Differences in Persistence

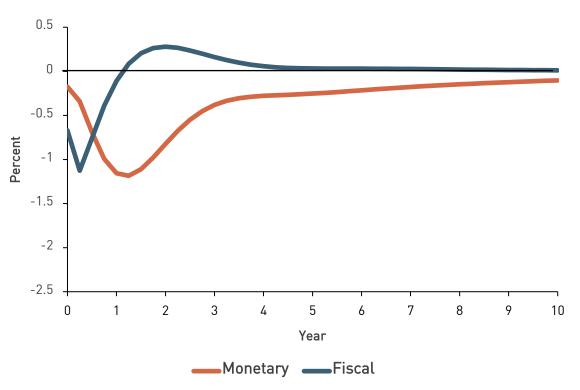
#### **Export Response to Econ Policy Uncertainty**



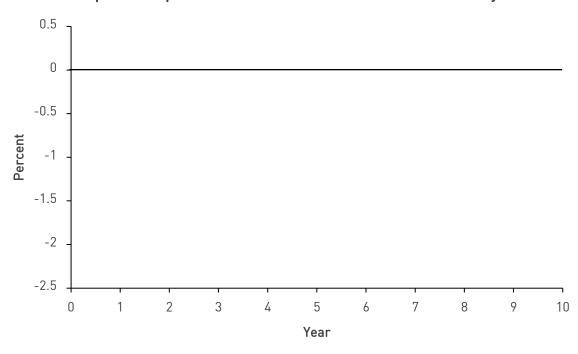


### Differences in Persistence

#### **Export Response to Econ Policy Uncertainty**

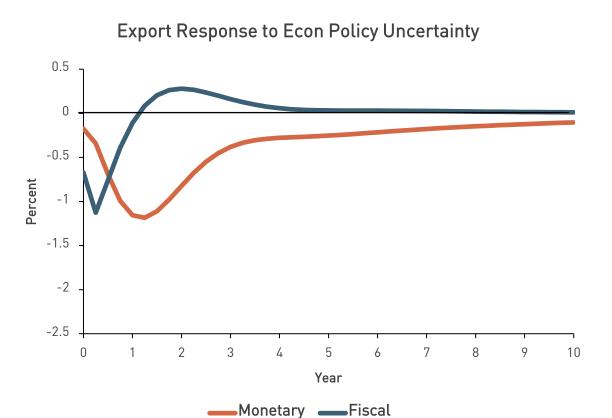


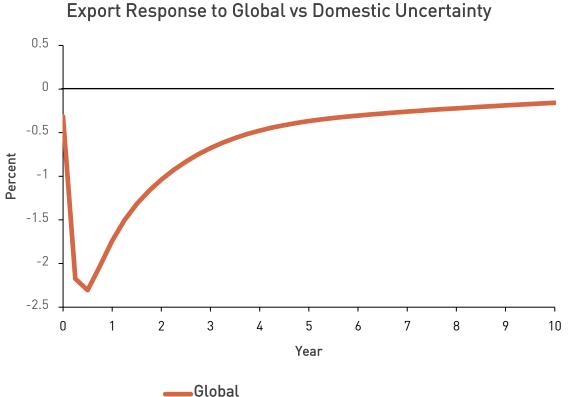
#### Export Response to Global vs Domestic Uncertainty





#### Differences in Persistence

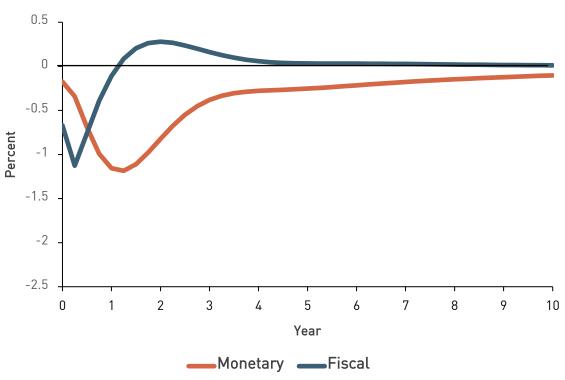




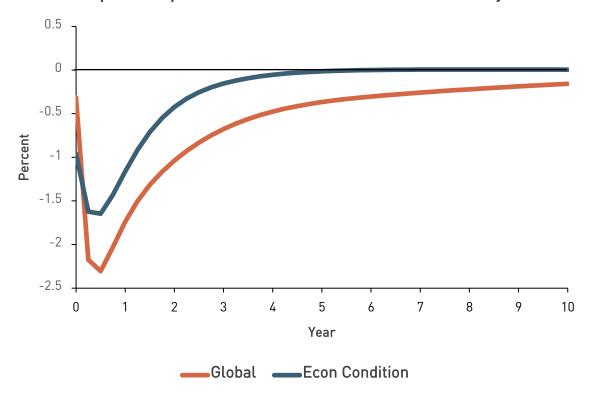


#### Differences in Persistence

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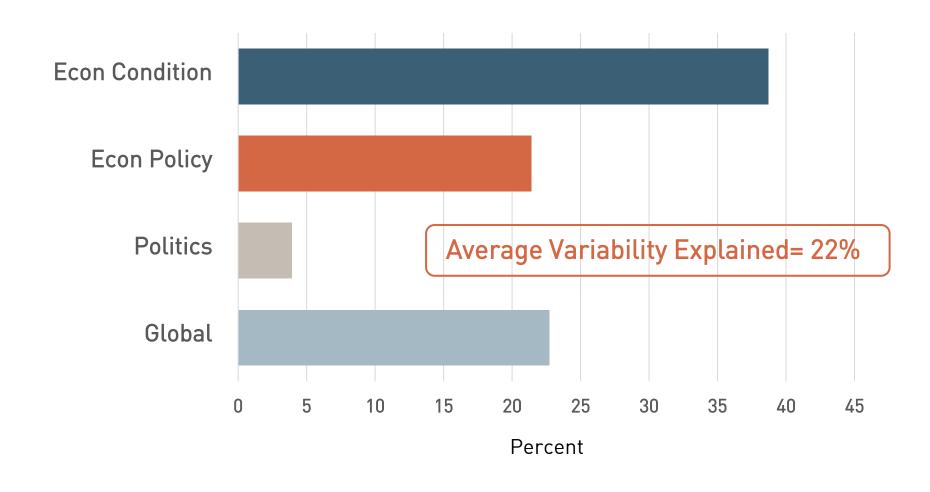


#### Export Response to Global vs Domestic Uncertainty





#### Contribution to Output Fluctuations

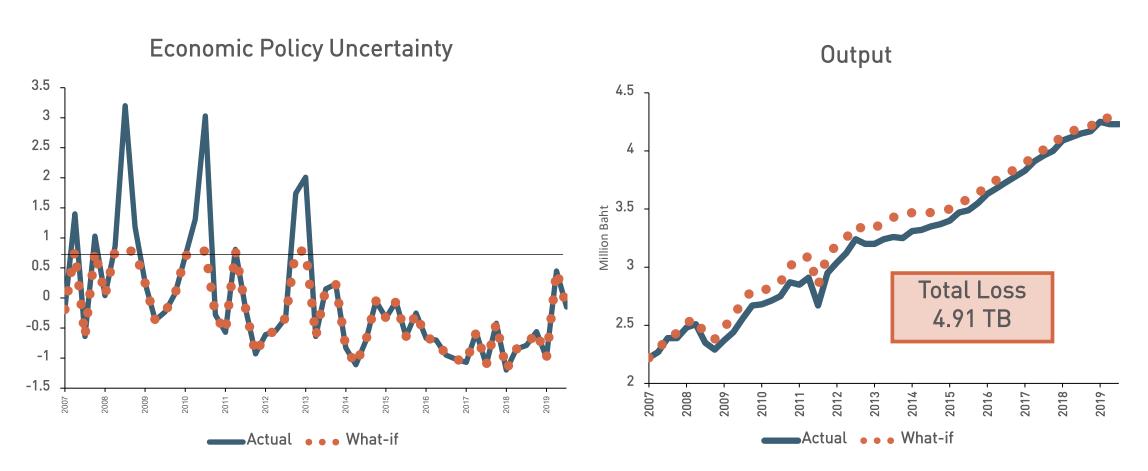




## What are the costs? Can monetary policy help?



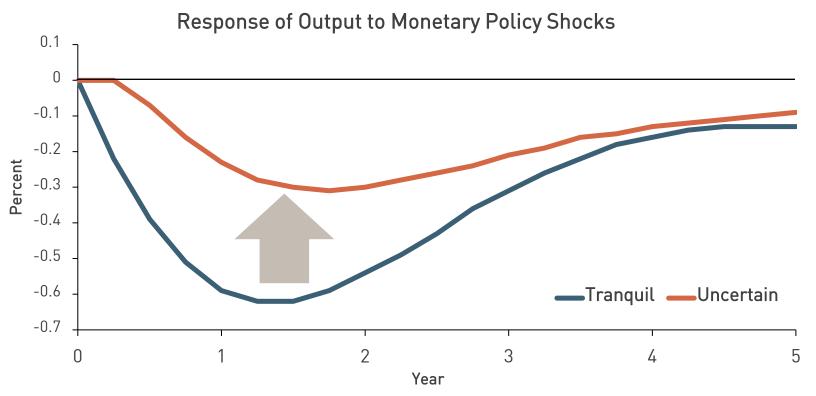
## High Costs



Note: What-if scenarios consider uncertainty being less than or equal to the 8th decile of the distribution.



### Limits of Monetary Policy

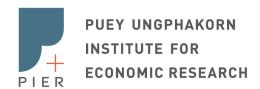


Note: "Uncertain" ("Tranquil") times distinguish between levels of global economic policy uncertainty being greater than (less than or equal to) the 8<sup>th</sup> (2<sup>nd</sup>) decile of the distribution.



#### Takeaways

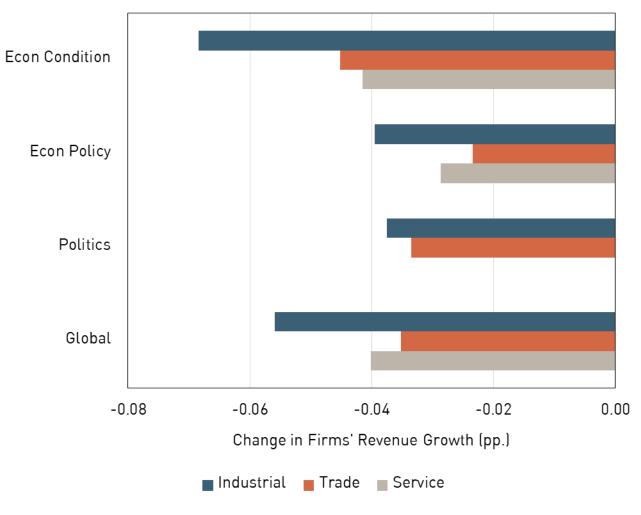
- Uncertainty shocks are contractionary but differ in impact and persistence
- Costs of uncertainty are high, while there are limits to what monetary policy can do



# How does uncertainty affect firms' outputs?



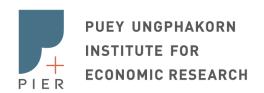
## Uncertainty inhibits firms' growth



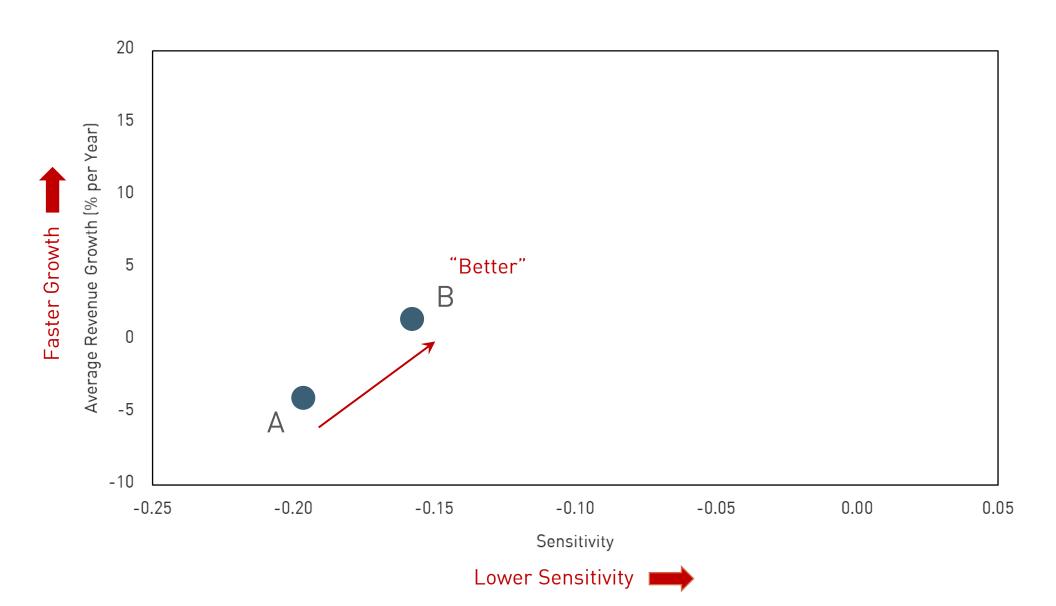
Uncertainty affect firms' revenue growth in all sectors.



## Does uncertainty have different effects across firms and industries?

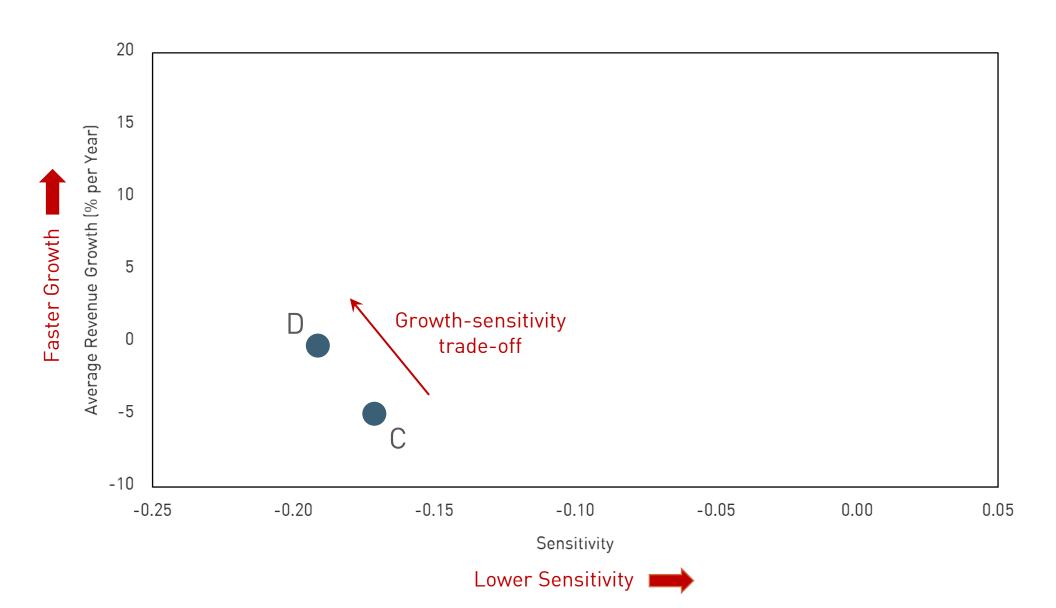


## Growth-Sensitivity Trade-Off



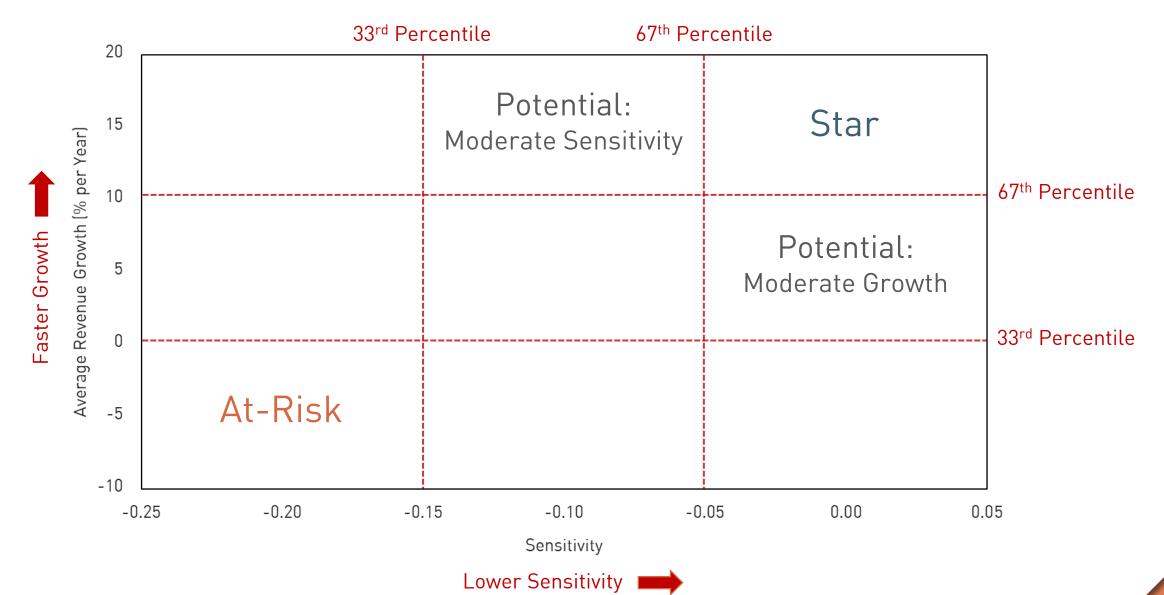


## Growth-Sensitivity Trade-Off



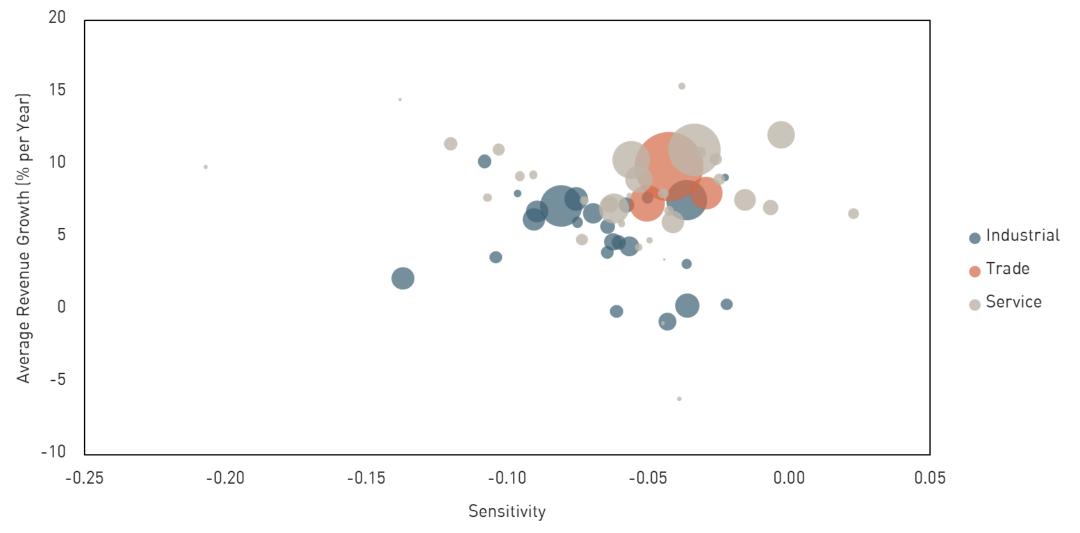


## Growth-Sensitivity Trade-Off





#### **Econ Condition**

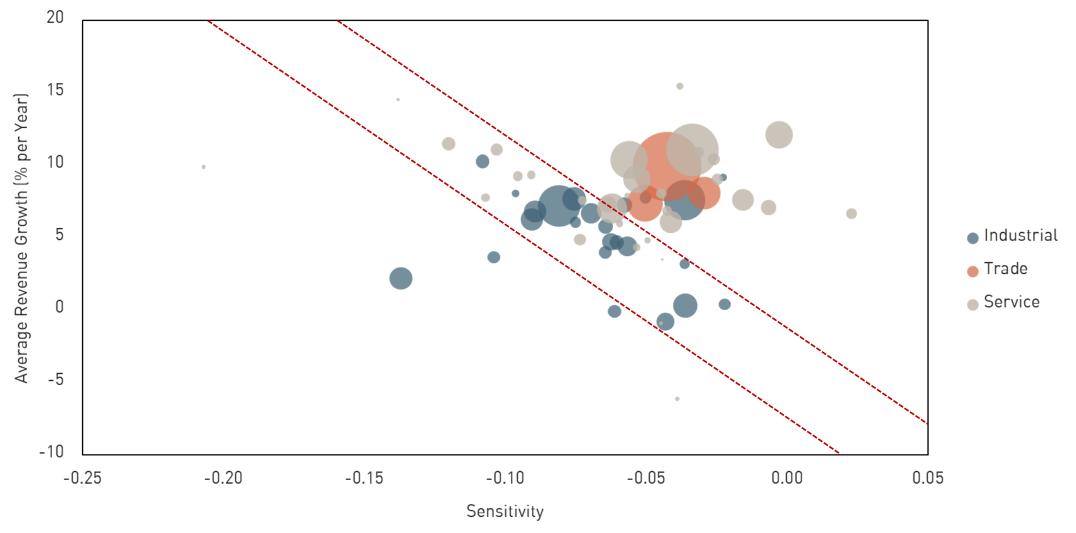


Note: Bubble size represents the number of workers in each industry.

Source: Authors' calculation based on data from the Department of Business Development, Ministry of Commerce and the National Statistical Office.



#### **Econ Condition**

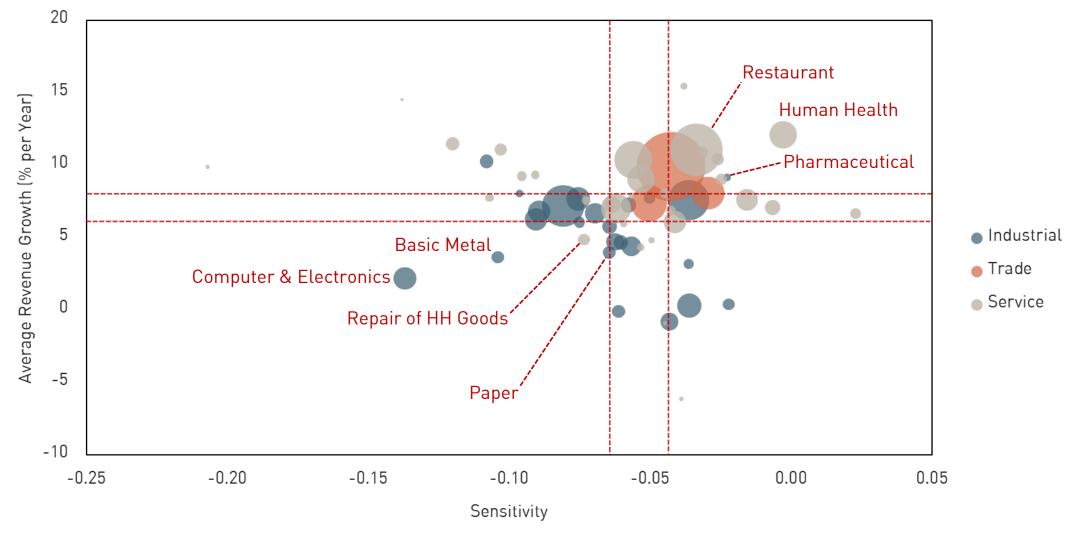


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#### **Econ Condition**



Note: Bubble size represents the number of workers in each industry.

Source: Authors' calculation based on data from the Department of Business Development, Ministry of Commerce and the National Statistical Office.



#### Stars, At-Risk, and Potential Industries

#### Potential: Moderate Sensitivity

Retail Trade

Education

Postal & Courier Scientific R&D Broadcasting Information Service

#### At-Risk

Computer & Electronics

Electrical Equipment Paper Basic Metal Repair of HH Goods Civil Engineering Rental & Leasing

#### Stars

Restaurant

Auto Trade Human Health

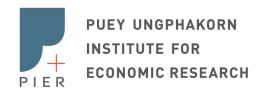
Service to Buildings Library & Museum
Legal & Accounting Security & Investigation
Pharmaceutical

#### Potential: Moderate Growth

Food

Financial Service Hotel

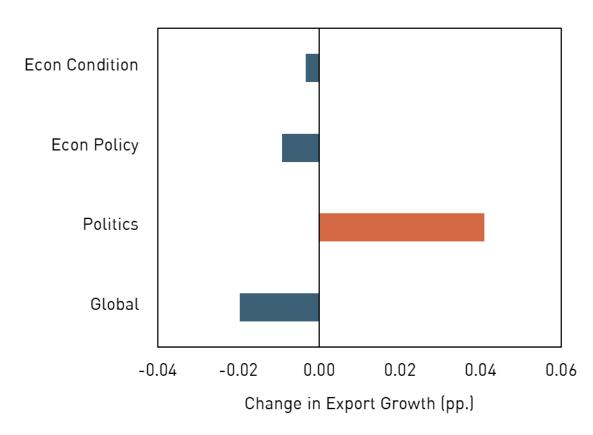
Real Estate Telecommunication
Office Admin & Support Entertainment
Computer Programming



## How do firms respond to uncertainty?



#### Market Diversification



Facing uncertainty in politics, firms move away from the domestic market by increasing their exports.

Source: Authors' calculation based on data from the Customs Department, Ministry of Finance.



#### Uncertainty from Main Trading Partners

#### Sources of Uncertainty US China Japan **Export Growth** М М US Main thina Japan Singapore Malaysia **Export** Southeast **I**hdonesia **Destinations** Asia Vietnam Philippines Firm's Size ΗK South Korea Taiwan Australia New Zealand Other Asia India UAE Saudi Arabia Turkey Israel

Russia



#### Global Connectedness

Export Growth		US			China			Japan			
		S	М	L	S	М	L	S	М	L	
Main	US										
	China										‹
	Japan										<u>ار</u>
Southeas Asia	Singapore										
	Malaysia										
	Indonesia										
	Vietnam										
	Philippines										<b>)</b>
Other Asia	HK										
	South Korea										
	Taiwan										
	Australia										
	New Zealand										
	India										<u> </u>
	UAE										
	Saudi Arabia										
	Turkey										
	Israel										
	Russia										

Increasing uncertainty from main trading partners lowers the growth of exports to these destinations.

And even more so for export to other Asian countries, especially for the medium-sized firms



#### **Export Diversification**



Firms respond by diversifying to other destinations

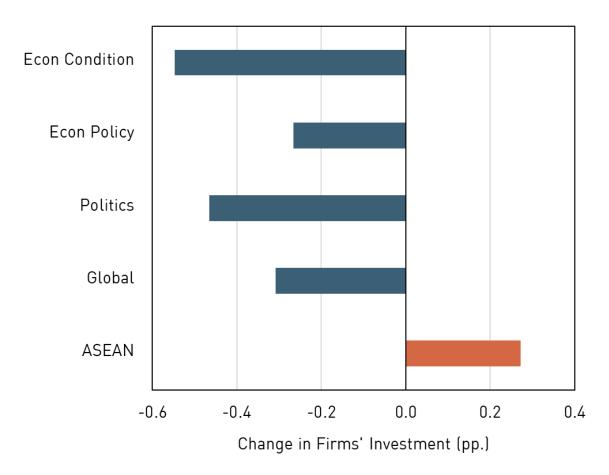
Source: Authors' calculation based on data from the Customs Department, Ministry of Finance.



## Is there a long-term impact of uncertainty?



#### Uncertainty suppresses investment



All four main types of uncertainty have a negative impact on firms' investment.

Uncertainty in ASEAN countries has a positive impact on firms' investment.

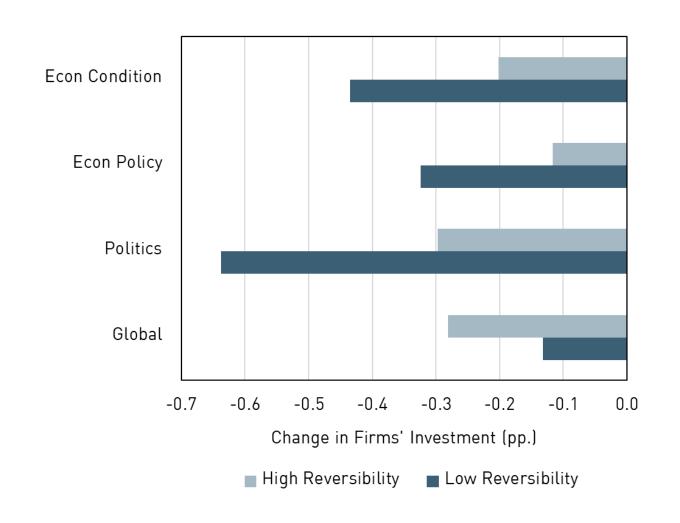
Source: Authors' calculation based on data from the Department of Business Development, Ministry of Commerce.

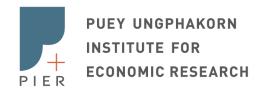


## The Real Option Hypothesis

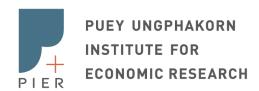
Facing uncertainty, firms might prefer the "wait-and-see" strategy and postpone their investment projects.

The real option hypothesis predicts that this effects will be stronger for the firms of which investment is less reversible.





## How well firms cope with uncertainty in the short run?



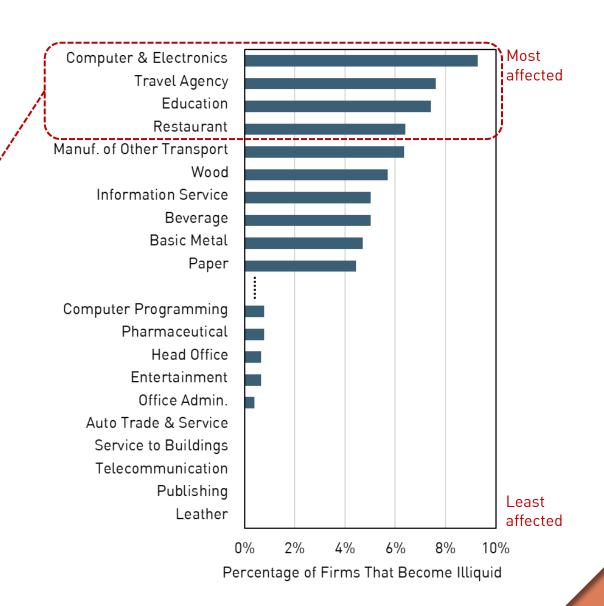
## Uncertainty and Firms' Liquidity

Given global uncertainty equivalent to that in 2008, how many good firms in normal time would become illiquid?

On average, 2.2% of good firms would face liquidity problem.

#### The 4 most-affected industries are

- Computer & Electronics
- Travel Agency
- Education
- Restaurant

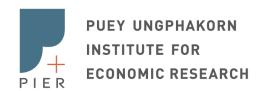




## Key Takeaways

- Impacts from uncertainty differ across firms and industries
- Facing uncertainty, firms diversify their sources of revenue by increasing their exports and also by exporting to other destinations
- Uncertainty could create illiquidity shocks for an otherwise good firm





#### 1. Reduce uncertainty when possible

Government and policy makers can lower policy uncertainty via

- Effective communication
- Lower coordination failures



#### 2. Restructure toward "Star" industries

- Consider not only growth but also vulnerability
- Support "star" industries such as Human Health, Restaurant, or Pharmaceutical



#### 2. Restructure toward "Star" industries

- Consider not only growth but also vulnerability
- Support "star" industries such as Human Health, Restaurant, or Pharmaceutical
- Facilitate "potential" industries such as Retail Trade or Food to become stars



## 3. Liquidity for vulnerable but otherwise performing firms

#### Government:

- Facilitate access to hedging instruments
- Provide short-term liquidity for good firms during the time of heighten uncertainty
- Support businesses (including SMEs) in entering other foreign markets





#### Disclaimer

The opinions expressed in this presentation are those of the authors and should not be attributed to the Bank of Thailand or the Puey Ungphakorn Institute for Economic Research.