# Twitter-Based Economic Policy Uncertainty Index for Chile

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# Motivation

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  - Civil protests and riots in mid-October 2019
  - Covid-19 pandemic in mid-March 2020

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### This paper

- Develop an uncertainty measure at a daily frequency (DEPUC) using the informational content of tweets
- ► Methodology based on Baker et al. (2016)
  - ★ Coverage frequency of keywords
  - ★ 5-steps procedure



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Twitter accounts

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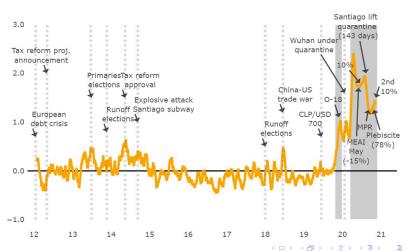
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- For each account type, standardize the resulting series to express their magnitudes as units of standard deviations
- For each day, average the standardized series across type of Twitter accounts

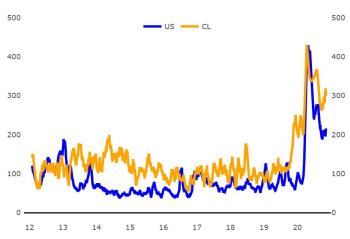
### Uncertainty Measure for Chile

Figure: Daily Economic Policy Uncertainty for Chile



### Uncertainty Measure for Chile

Figure: Economic Policy Uncertainty in Chile and US



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#### Exchange Rate and Uncertainty

Dynamics of the Chilean peso - US dollar exchange rate

$$e_{t+h} = \alpha_{s_t}^h + \beta_{s_t}^{h'} X_t + u_{t+h}, \qquad h = 0, 1, 2, \dots, \quad s_t \in \{L, H\}$$

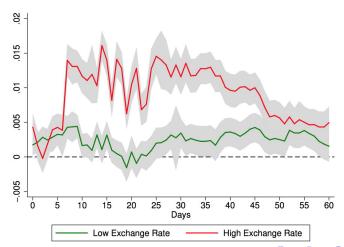
- Regressors in X<sub>t</sub> Graphs
  - ★ Broad index
  - EMBI Global
  - \* Copper and oil price
  - ★ Inflation in Chile and in the US
  - ★ Interest rate differential
  - VIX or IPSA volatility
  - **★** DEPUC

Estimation results



#### Exchange Rate and Uncertainty

Figure: Effects of DEPUC on Exchange Rate



# Conclusions

- Development of daily-frequency measure of economic uncertainty for Chile based on information obtained from Twitter
- Tweets coverage frequency of keywords related to the economy, economic policies, uncertainty, and current local economic situation
- Dynamics of the measure coincides with several episodes of substantial economic uncertainty of both local and international origin
- Proposed measure is a significant determinant of the nominal exchange rate in Chile

#### Twitter Accounts Considered

#### (thousands)

Category	Official Twitter Account	Joined	Followers	Tweets since start
	@CHVNoticias	Jun-09	1,154.7	78.1
Newscasts	@T13	Mar-09	3,234.7	564.4
	@CNNChile	Dec-08	3,300.1	353.7
	@24HorasTVN	Nov-09	3,696.7	706.0
	@Puntonoticias_	Sep-14	4.0	1.6
Newspapers	@Emo1	May-10	1,981.2	555.5
	@DFinanciero	Aug-09	203.0	194.3
	@EYN_ELMERCURIO	Sep-09	63.3	86.5
	@elmostrador	Jan-08	1,769.5	236.7
	@pulso_tw	Nov-11	101.9	142.7
	@Estrategiacl	Jul-10	74.4	73.8
	@latercera	Apr-07	1,944.7	931.6
Radios	@biobio	May-08	3,213.6	792.5
	@adnradiochile	Oct-10	2,054.9	392.8
	@cooperativa	Jul-07	2,935.3	999.9

All statistics as of June 22, 2020.

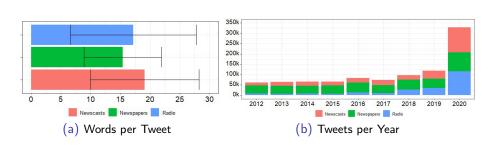


### Dictionary of Keywords

Category Subcategory		Words / Terms			
Economy (E)		Any word / term beginning with "econ"			
Policy (P)	Fiscal policy	"politica fical", "impuesto", "gasto publico", "deficit fiscal", "presupuesto", "tributaria", "deuda publica", "gasto fiscal", "presupuesto fiscal", "Ministerio de Hacienda", "Hacienda"			
	Monetary policy	"Banco Central", "politica monetaria", "Reserva Federal", "FED", "tipo de cambio", "BCCh", "dolar"			
	Trade policy	"arancel", "tratado de libre comercio", "TLC" "comercio internacional"			
Uncertainty (U)		Any word $/$ term beginning with "incer" and "incier"			
Economic situation Chile (C)		"pais", "estallido social", "crisis", "crisis social", "nomasafp", "AFP", "colusion", "pensiones", "nueva constitucion", "constitucion", "asamblea constituyente", "asamblea", "constituyente", "COVID", "coronavirus", "pandemia"			

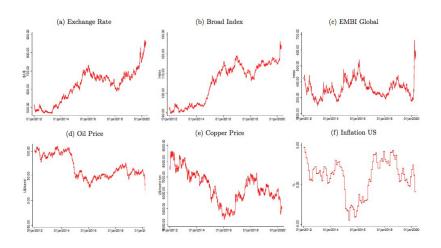
### Tweets by Type of Account

Figure: Tweets by Type of Account

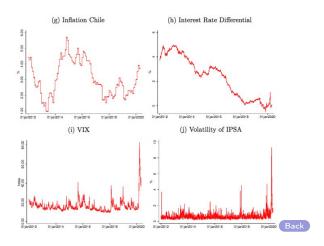


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#### **Estimation Variables**



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# ${\sf Appendix}$

#### **Estimation Results**

	(1)		(2)		(3)	
	Low	High	Low	High	Low	High
Broad Index	0.844	0.684	0.760	0.660	0.834	0.691
	(0.022)	(0.019)	(0.040)	(0.023)	(0.038)	(0.021)
EMBI Global	0.020	0.052	-0.003	0.065	0.018	0.047
	(0.007)	(0.006)	(0.008)	(0.007)	(0.007)	(0.005)
Oil Price	0.013	-0.022	0.020	-0.013	0.012	-0.021
	(0.004)	(0.004)	(0.004)	(0.004)	(0.004)	(0.003)
Copper Price	-0.197	-0.199	-0.191	-0.205	-0.203	-0.200
	(0.010)	(0.008)	(0.013)	(0.008)	(0.014)	(0.008)
Inflation US	-0.001	-0.002	-0.004	-0.003	0.000	-0.003
	(0.001)	(0.000)	(0.001)	(0.000)	(0.001)	(0.000)
Inflation Chile	0.013	0.013	0.013	0.013	0.013	0.013
	(0.001)	(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
Interest Rate Diff.	-0.046	-0.030	-0.051	-0.031	-0.045	-0.029
	(0.001)	(0.001)	(0.002)	(0.001)	(0.002)	(0.001)
DEPUC	0.002	0.003	0.001	0.002	0.002	0.003
III	(0.001)	(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
VIX			0.015	0.016	2500,100,000	
			(0.004)	(0.003)		
IPSA Volatility			10.000		0.005	0.010
					(0.001)	(0.001)
Constant	4.156	4.770	4.568	4.860	4.261	4.763
	(0.129)	(0.140)	(0.276)	(0.162)	(0.252)	(0.157)
рнн	0.995		0.995		0.995	
	(0.002)		(0.002)		(0.002)	
$p_{LH}$	0.011		0.009		0.011	
	(0.004)		(0.004)		(0.004)	
Observations	2,170		2,170		2,170	
Log Likelihood	5,697.6		5,722.0		5,738.9	
SBIC	-5.177		-5.192		-5.208	

