



# The spread of economic crisis in an interconnected financial network

---

Davide Callegaro, Laura Caviezel, Mikkel Duif, Lars Horsbol, Matteo Rigoni





# The Problem

# Economic Crisis

## Working questions

- At what speed does an economic crisis spread?
- What is the importance of crisis origin?
- Which countries will be affected the most?
- When should politicians and central banks take the most action?





# The Approach

# Two-fold approach

Connectivity of national economies

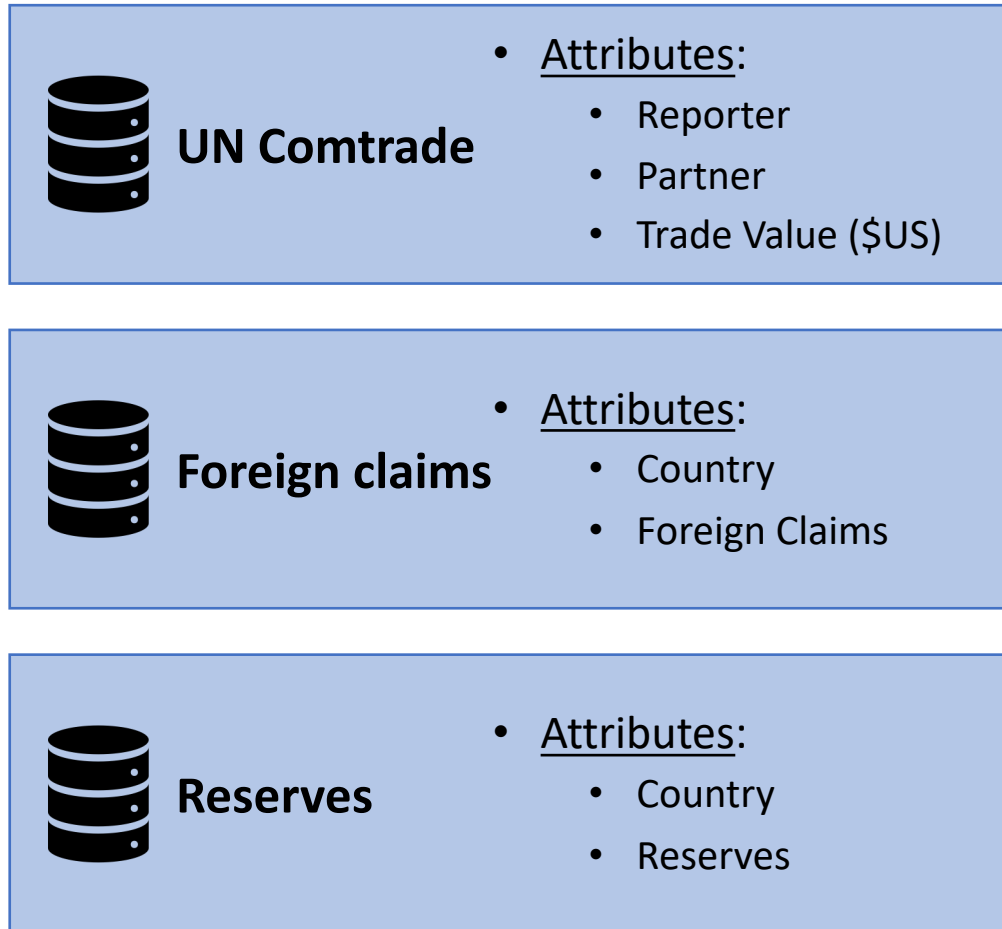
Weighted  
directed Network  
graph

+

Epidemiological spreading of crises

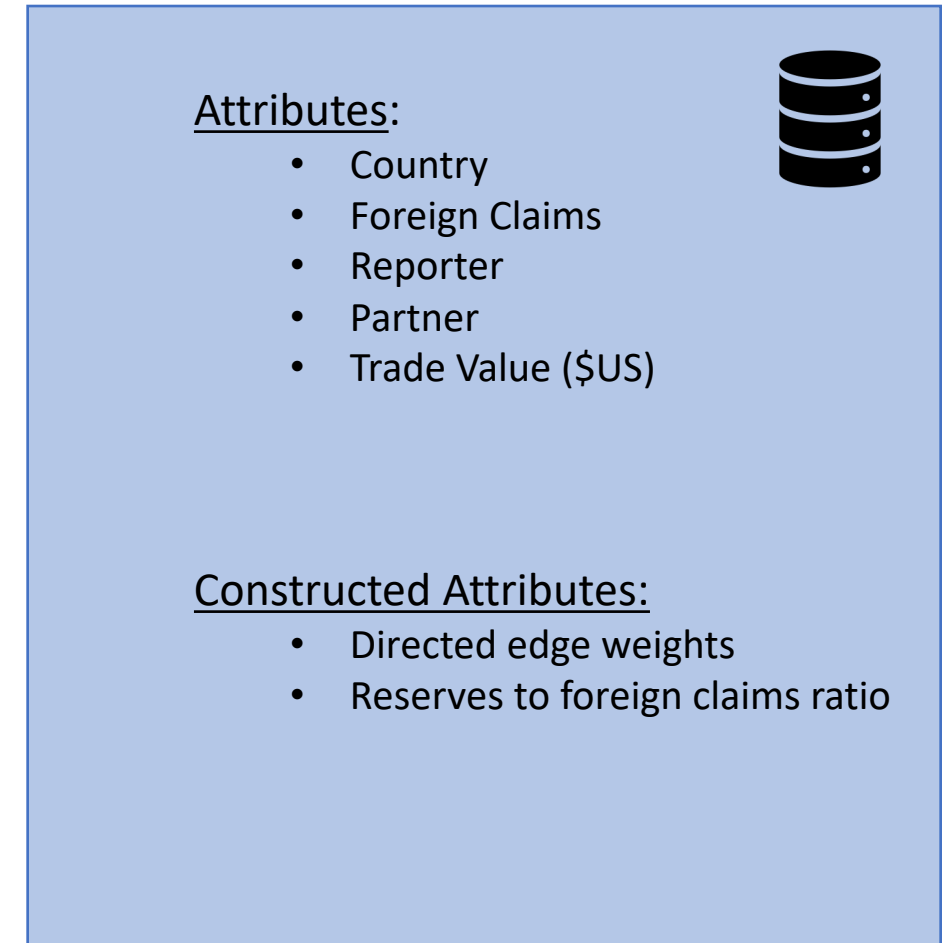
SIS experiments  
based on MMCA  
model

# Data exploration



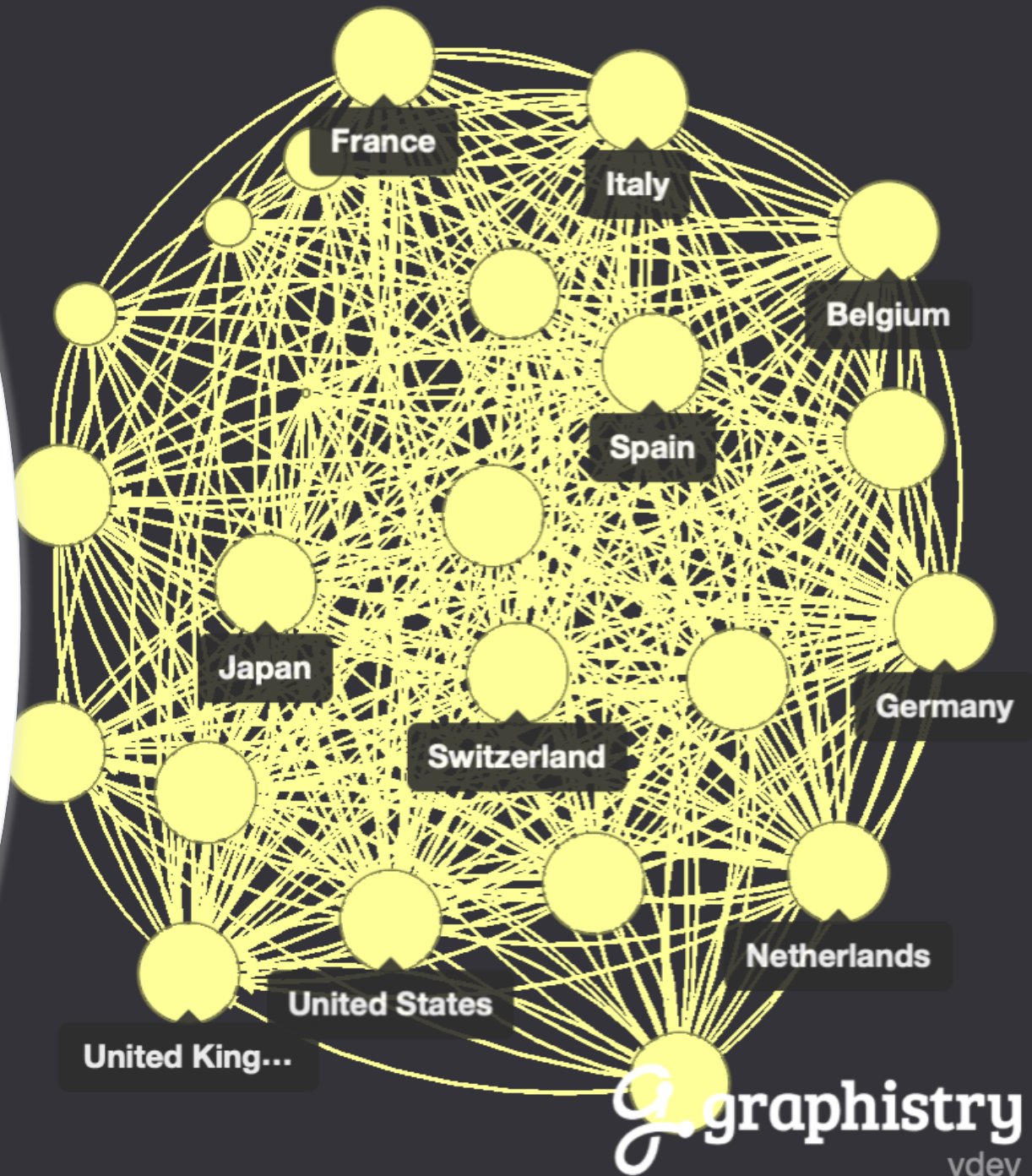
Merge on  
Country

## Final Data



23 Countries (nodes)  
354 Trade flows (edges)

---



# Network Topology

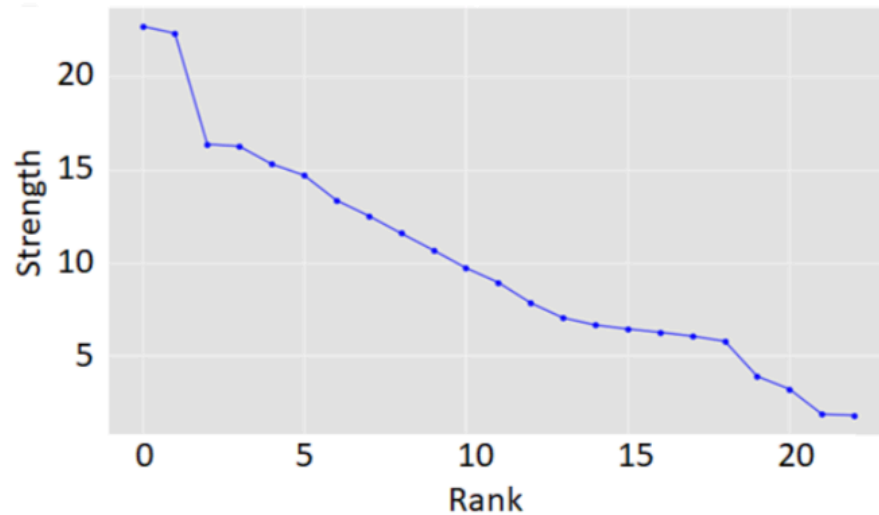


United Nations Comtrade

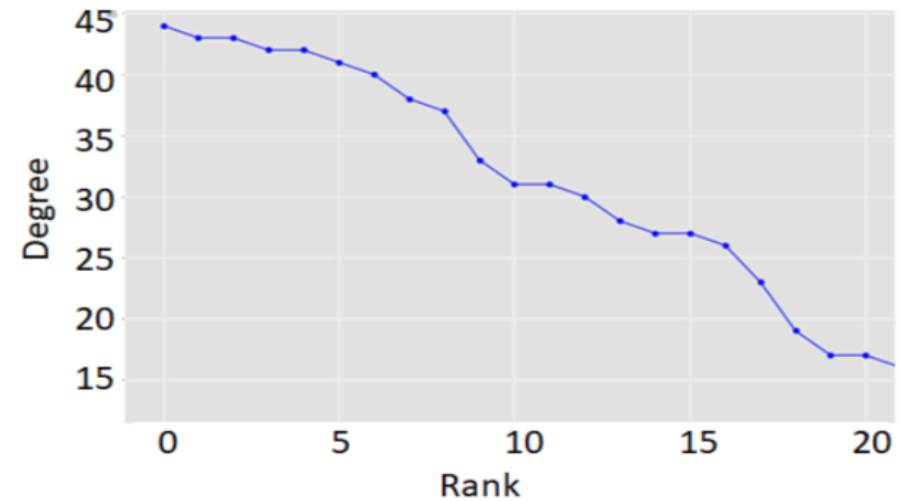


Excluded edges with strength in bottom 30 %

Strength Rank Plot



Degree Rank Plot





# Country selection for scenarios

## Top 3 most connected countries



UK



Germany



United States

## Bottom 3 least connected countries



Finland



Chile



Greece



Countries are selected based on edge weights

# MMCA Model

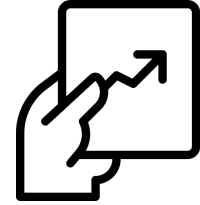
## Homogenous Model



Origin Country



$\beta$  Infectivity Rate



$\mu$  Recovery Rate







## Heterogenous Model



$\beta$  Modified Infectivity  
Rate based on high  
risk countries

# Country selection for beta manipulation

## Reserves to outstanding debt

	Netherlands	0.09943%
	Finland	0.17518%
	France	0.21333%
	Austria	0.29788%
	Germany	0.31586%
	United States	0.31880%

Countries with the lowest ratio are selected as «high risk» nations for which betas are manipulated to approximate real world

### Two scenarios:

Medium risk:  $\beta * 1.5$

High risk:  $\beta * 2$

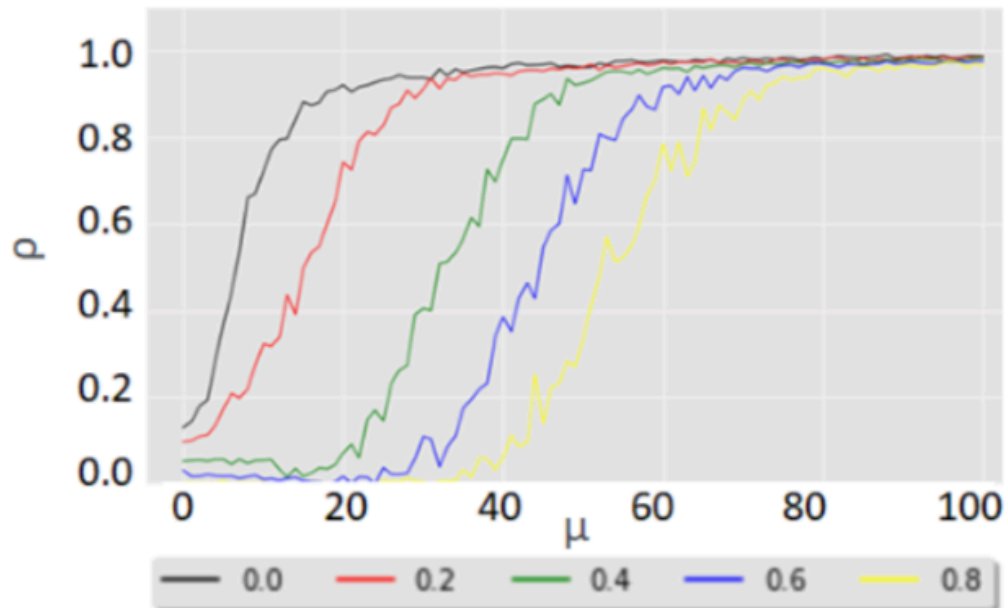


# The Results

# Homogenous Model

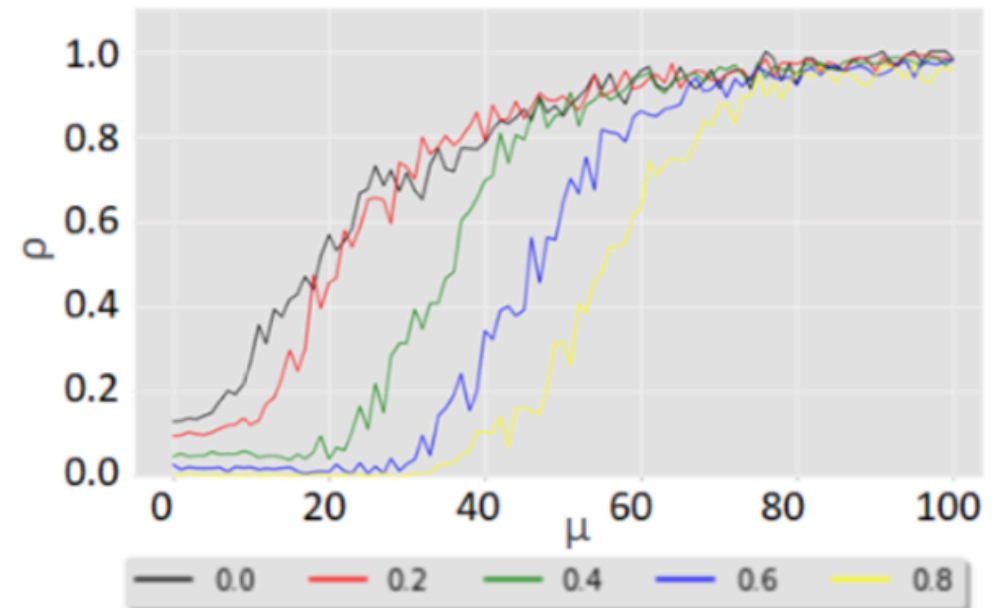
Initiated in Top 3 countries (US, UK, Germany)

Homogenous parameters



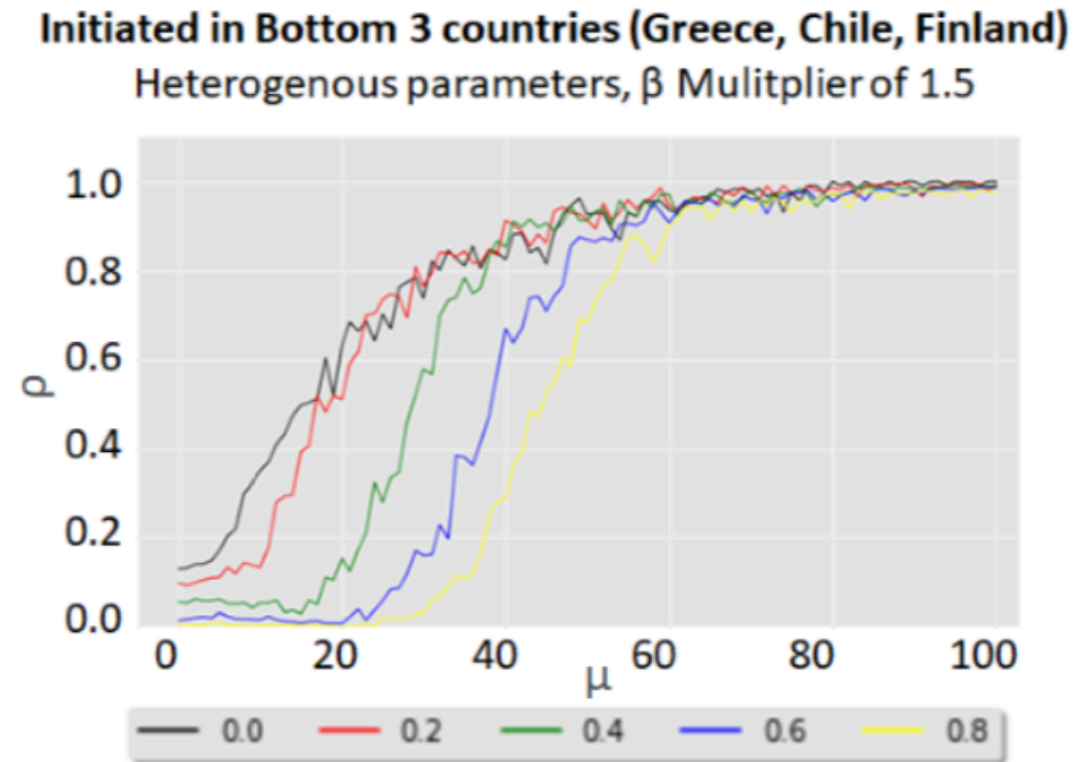
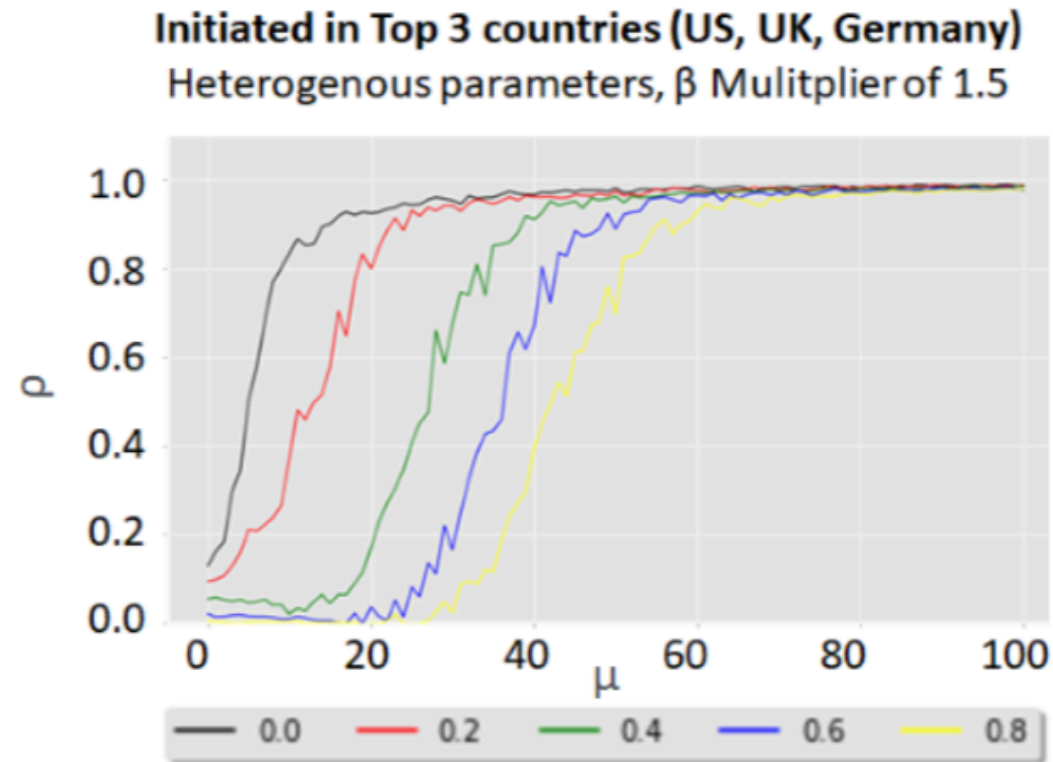
Initiated in Bottom 3 countries (Greece, Chile, Finland)

Homogenous parameters



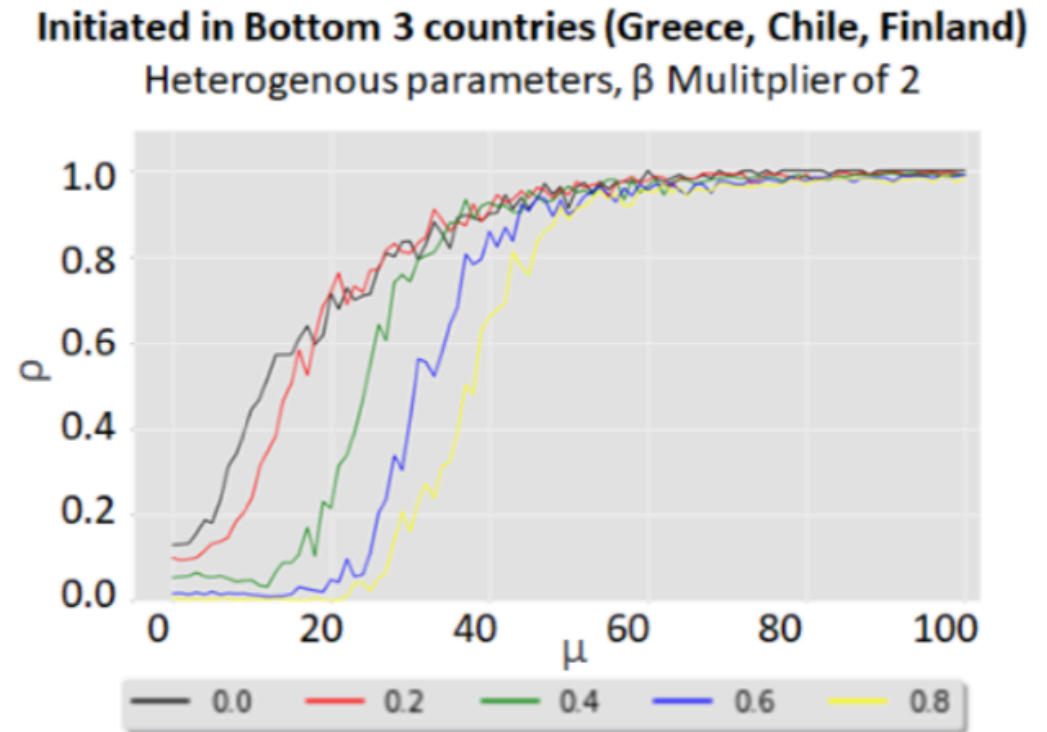
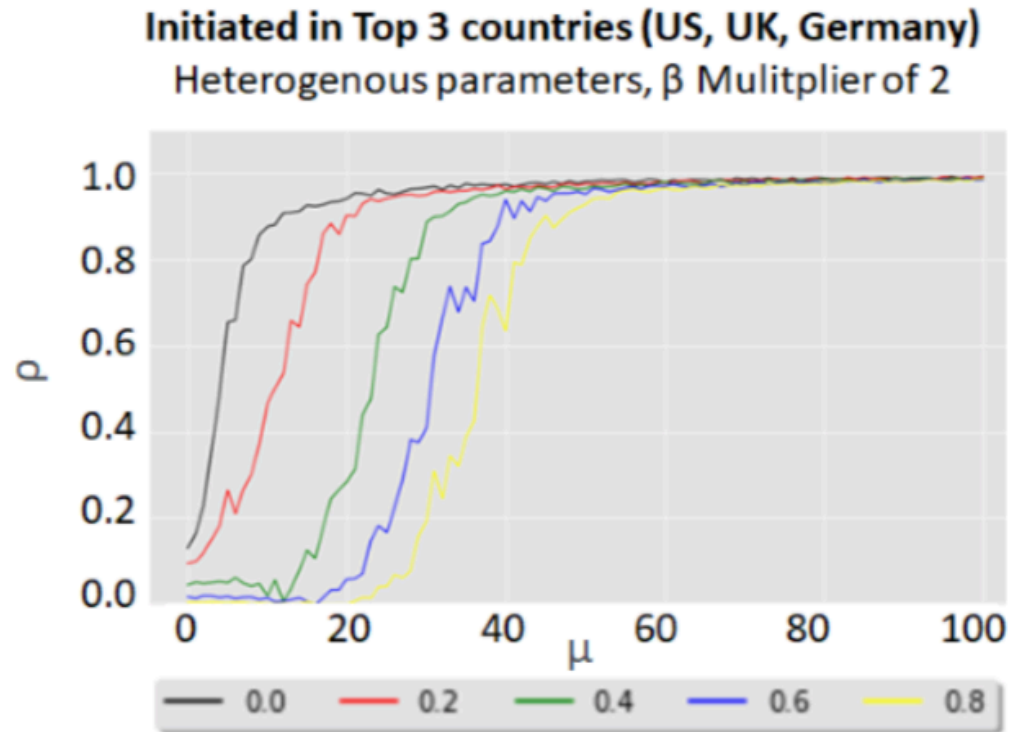
An economic crisis spread much faster when initiated in one of the three most interconnected nations

# Heterogenous Model (1.5)



Comparing to the homogenous model, the values of  $\beta$  necessary for the infection to reach 80% of the network have decreased across the board

# Heterogenous Model (2.0)

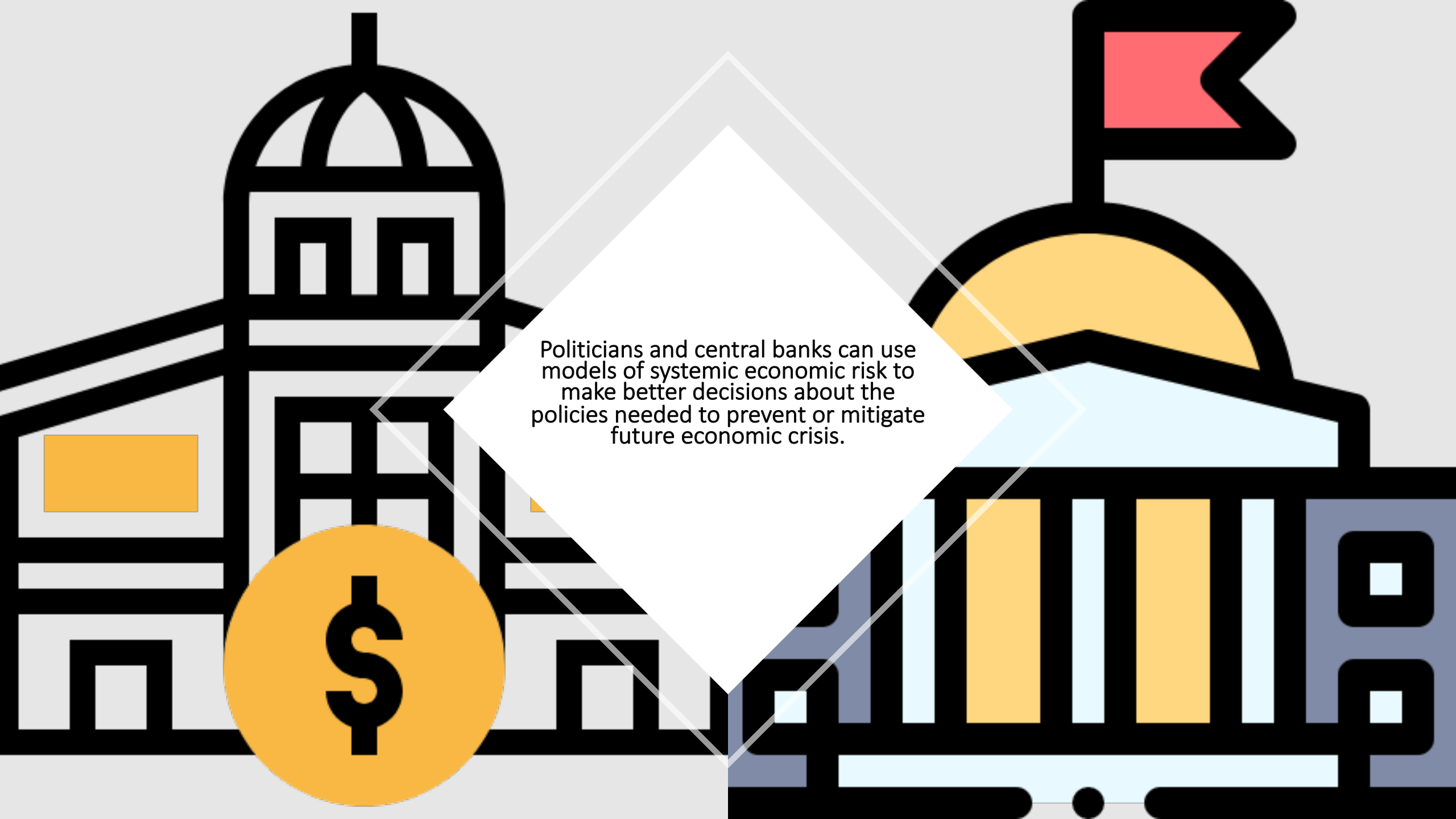


Increasing the multiplier to 2.0 creates an extreme case in which the countries that are considered to be at risk due to their values of reserves as a percentage of outstanding debt have their infectivity ratios ( $\beta$ ) doubled. This scenario continues the trend we have observed when we first introduced heterogeneity.



# The Implications



The background features a stylized illustration of a building with a large dome on the left and a flag on the right. A large yellow circle with a black dollar sign (\$) is positioned in the lower-left foreground. A white diamond shape with a thin black border is centered in the image, containing the text.

Politicians and central banks can use models of systemic economic risk to make better decisions about the policies needed to prevent or mitigate future economic crisis.

# Implications:

## Results:

Large differences in the severity of financial crisis dependent on the country of origin



Adding heterogeneity to the model increases the magnitude of the spread of the crisis across the network, but also decreases the impact of the inherent recovery rate



Some countries with the highest interconnectivity across the network, have the largest inherent risk on the basis of the reserve to outstanding debt ratio



## Economic Policy Implications:

Highly interconnected countries should be strongly monitored



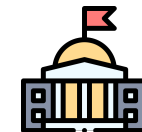
Prevention of a crisis may be a better approach than mitigation



Reserves over outstanding obligations ratio may be a good measure to identify a country's ability to sustain economic shocks.



Increasing minimum requirements of national reserves/debt ratios in strongly interconnected countries can significantly reduce the risk of a crisis to spread quickly across the network



# Gracias!

And Q&A

# Reserves Table – Multiplier Slide

Country Name	Reserves	GDP	Reserves % GDP	Outstanding Debt	Reserves % Debt
Netherlands	13,194,707,105 €	9,136,580,000,000 €	0.14%	13,271,000,000,000 €	0.09943%
Finland	8,284,157,187 €	2,767,430,000,000 €	0.30%	4,729,000,000,000 €	0.17518%
France	66,103,290,547 €	27,775,400,000,000 €	0.24%	30,986,000,000,000 €	0.21333%
Austria	11,653,251,921 €	4,552,860,000,000 €	0.26%	3,912,000,000,000 €	0.29788%
Germany	59,173,100,675 €	39,476,200,000,000 €	0.15%	18,734,000,000,000 €	0.31586%
United States	114,757,000,000 €	205,443,000,000,000 €	0.06%	35,996,000,000,000 €	0.31880%
Spain	59,030,411,978 €	14,190,400,000,000 €	0.42%	17,566,000,000,000 €	0.33605%
Canada	83,925,602,808 €	171,334,170,487,701 €	0.05%	18,979,000,000,000 €	0.44220%
United Kingdom	159,872,000,000 €	28,553,000,000,000 €	0.56%	36,057,000,000,000 €	0.44339%
Greece	2,918,421,299 €	2,180,320,000,000 €	0.13%	577,000,000,000 €	0.50579%
Ireland	4,975,323,463 €	3,824,870,000,000 €	0.13%	928,000,000,000 €	0.53613%
Italy	51,330,748,572 €	20,838,600,000,000 €	0.25%	8,516,000,000,000 €	0.60276%
Australia	51,048,086,920 €	14,339,000,000,000 €	0.36%	6,876,000,000,000 €	0.74241%
Belgium	17,486,655,859 €	5,427,610,000,000 €	0.32%	2,335,000,000,000 €	0.74889%
Portugal	9,158,607,287 €	2,406,750,000,000 €	0.38%	956,000,000,000 €	0.95801%
Sweden	55,385,715,101 €	5,560,860,000,000 €	1.00%	3,465,000,000,000 €	1.59843%
Japan	1,238,940,000,000 €	49,713,200,000,000 €	2.49%	43,718,000,000,000 €	2.83394%
Singapore	287,466,000,000 €	3,641,570,000,000 €	7.89%	5,676,000,000,000 €	5.06459%
Switzerland	744,167,000,000 €	7,051,400,000,000 €	10.55%	10,842,000,000,000 €	6.86374%
Korea	398,780,000,000 €	16,194,200,000,000 €	2.46%	1,978,000,000,000 €	20.16077%
Chile	39,848,699,140 €	2,982,310,000,000 €	1.34%	142,000,000,000 €	28.06246%
Turkey	72,866,830,470 €	7,713,500,000,000 €	0.94%	259,000,000,000 €	28.13391%
India	374,425,000,000 €	27,187,300,000,000 €	1.38%	856,000,000,000 €	43.74124%