



# SPAC – Social Physics and Complexity @LIP

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**FCT** Fundação para a Ciência e a Tecnologia



European Research Council Established by the European Commission







### SCIENCE AND COMPLEXITY

By WARREN WEAVER Rockefeller Foundation, New York City



These problems—and a wide range of similar problems in the biological, medical, psychological, economic, and political sciences—are just too complicated to yield to the old nineteenth-century techniques which were so dramatically successful on two-, three-, or four-variable problems of simplicity. These new problems, moreover, cannot be handled with the statistical techniques so effective in describing average behavior in problems of disorganized complexity.

These new problems, and the future of the world depends on many of them, requires science to make a third great advance, an advance that must be even greater than the nineteenth-century conquest of problems of simplicity or the twentieth-century victory over problems of disorganized complexity. Science must, over the next 50 years, learn to deal with these problems of organized complexity.



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### QUESTIONS

### DATA

### TOOLS

Online vs. Offline Patterns Emergency Now-casting Antibiotic Over-prescription Google Trends SNS24 Twitter ER acceptance /times SPMS e-prescriptions

Math Modelling ML Epidemiology

- Gend Agen Votin
- Political Decisions Gender Differences Agenda Setting Voting vs. Discourse

Media records Twitter Facebook Parliament data NLP Networks Math Modelling Complex Systems

BEHAVIOUR



Cognitive Biases Attitudes Towards Science Tracking Anxiety

- Large scale surveys Behavioral experiments Twitter Facebook
- Networks Math Modelling Psychology Information











# 1- INDIVIDUAL CHARACTERISTICS THAT PROMOTE "DISEASE" SUSCEPTIBILITY

Frederico Francisco, Simone Lackner, Cristina Mendonça, Ângela Rijo





# 2- DISINFORMATION, TRACKING, AND BEHAVIORAL TARGETING

Íris Damião, Alex Davidson (former member), Cristina Mendonça, Lília Perfeito, José Reis







# **3- INFORMATION FLOW ON NETWORKS**

Paulo Almeida, Pedro Duarte, Tiago Miranda, Lília Perfeito





# 4 - DYNAMICS OF NON-INFLUENZA RESPIRATORY VIRUSES (NIRVS)

João Loureiro, Sara Mesquita, Lília Perfeito, Pedro Rio, Eleonora Tulumello, Irma Varela





# 5- PROTECTING PERSONAL DATA WITH MULTI-PARTY COMPUTATION

Paulo Almeida, Hugo Cachitas, Alex Davidson (former member)





# INDIVIDUAL CHARACTERISTICS THAT PROMOTE "DISEASE" SUSCEPTIBILITY

Frederico Francisco, Simone Lackner, Cristina Mendonça, Ângela Rijo



# Individual susceptibility



UNESCO's World Trends Report

Question:

What individual characteristics explain irrational judgment and behavior (e.g., fake news sharing)?

Objectives:

- a. Identify individual characteristics that influence negative judgment / behavior.
- **b.** Test whether individual characteristics improve our "disease" models.



# Individual susceptibility

Datasets:

a. Already existing large-scale surveys (demographics, attitudes, opinions, perception of risk, etc.).

Survey	Start	Frequency	Countries	Sample size
Eurobarometer	1974	Twice a year	EU countries	~1,000 per country
European Social Survey	2001	Every two years	30+ countries	~800 – 1,500 per country
General Social Survey	1972	Every two years	United States	~1,500 - 6,000

b. Surveys / experiments we design ourselves, e.g.:





# Individual susceptibility

Tools:

- A. Statistics & data visualization.
- B. Agent-based modeling.
- C. Integration of this individual-level data with environment and pathogen data.





Hay naku I So it's been around then ? 😕 & How did they know about a Virus we knew nothing about ? 😕 Well ,This is definitely a Government Conspiracy lysol labels as proof the government knew in advance about the Corona virus .

Corona Virus is nothing new.



**COGNITIVE BIAS** 



Overconfidence peaks at intermediate knowledge levels

**COGNITIVE BIAS** 



**COGNITIVE BIAS** 



Overconfidence peaks at intermediate knowledge levels



### **Perfect metacognition**





### **Random answering**





### **DKE prediction**









D 1.0 0.9

Fraction

0.8

0.7 0.6 0.5 0.4 0.3

0.2

0.1

0.0

0

1 2 3 4 5

в 1.0 0.9

Fraction

Ε

Fraction

0.8

0.7 0.6 0.5 0.4

0.3

0.2

0.1

0.0



0 1 2 3 4 5 6 7 8 9 10 11 12



0 1 2 3 4 5 6 7 8 9 101112



0.5 0.4

0.3

0.2

0.1 0.0 -0.1

-0.2

-0.3

-0.4

-0.5

Calibration error O





**GSS** Data Explorer







Correct Don't Know

6789

### This has implications for attitudes towards science







# DISINFORMATION, TRACKING, AND BEHAVIORAL TARGETING

Íris Damião, Alex Davidson (former member), Cristina Mendonça, Lília Perfeito, José Reis



### Newsweek repeatedly ran "sponsored" articles advertising colloidal silver as a way to prevent or treat COVID-19

One sponsored Newsweek article falsely claimed that "Black Americans can help protect themselves from COVID-19" by using a colloidal silver brand

WRITTEN BY ERIC HANANOKI PUBLISHED 09/07/21 11:31 AM EDT SHARE COMMENT General Objective:

- **a. Identify** disinformation articles from known fact checkers
- Measure tracking and thirdparty content in disinformation websites
- **c. Test** whether differential tracking and content targeting occurs in disinformation websites





# Building a fake news database

Main data sources:

- EU v. Disinfo;
- Google Fact Check tools + ClaimReview Schema;



Challenges:

- Low adoption of ClaimReview;
- Mostly political topics;



# Measuring online social bubbles

Dimitar Nikolov, Diego F.M. Oliveira, Alessandro Flammini and Filippo Menczer



Adapted from https://peerj.com/articles/cs-38/

#### **EXPERIMENT**





#### **STEP1 : Create browsing HISTORIES**

2 virtual agents (OpenWPM) visited 500 websites:

- **Treatment**: random sample of fake news websites from our DB
- **Control**: random sample stratified by top-level domain from Alexa's top 1M websites worldwide
- Same geo-location: USA, Miami
- Ran sequentially /parallel

#### **EXPERIMENT**





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#### **STEP2 : TRACKING AUDIT**

- Collect all HTTP-requests, redirect, responses, and javascript code along with metadata;
- Identify ads and store the raw html code;
- Identify third-parties;
- Collect cookies.

#### **EXPERIMENT**





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### **STEP3 : SEARCH ENGINE AUDIT**

Each bot visited 6 search engines and typed the same queries. We collect:

- Auto-complete suggestions (where available)
- Ranked results of the first 10 pages/scrolls



#### COOKIES

### Disinformation websites tend to place more cookies





### Profiles influence search results (both query and auto-complete)





### Profiles that visited disinformation websites are directed to poorer quality content



RESULTS



- 1. Designed and implemented an experiment to audit tracking and its influence on search engine results;
- 2. Disinformation websites tend to place more cookies;
- 3. Profiles/ browsing history influence search results (both query and autocomplete);
- 4. Some search engines might be more worrisome than others;
- 5. Profiles that visited disinformation websites are directed to poorer quality content;

- Running bots in parallel
- Increasing geo-locations
- Analyzing ads (from Google)







# **INFORMATION FLOW ON NETWORKS**

Paulo Almeida, Pedro Duarte, Lília Perfeito





### Questions

- Can we estimate the fitness of a tweet?
- What is the contribution of the network?
- What is the contribution of individual heterogeneity?
- Why do some tweets spread further than others?



Data:

- Tweets and user profiles (from Twitter API)
- Feed into database (being built)
- Group tweets by content (cascades)





Tools:

- Model process:
  - Analytical model diffusion, population dynamics, epidemiological, etc.
  - o Simulations
- Fit observations and compare parameters
- Estimate the effect of different features of tweets, network and users







We do not require the network to explain the cascade size distribution ...

 $N(t) = e^{\frac{a}{g}} e^{a \cdot e^{-g \cdot t}} \qquad f_N(N) = f_{a/g}(\log(N)) \cdot \frac{1}{N}$ 

... but it is there. What is the contribution of the network?

 $\Delta N = N \cdot a \cdot e^{-g \cdot t} \cdot f(t)$ 

Simulations in development ...



To be added to the framework:

- Classification of tweets in topics, sentiment, fake&real news, etc.
- Heterogeneity in users demographic. psychological properties, etc.





# DYNAMICS OF NON-INFLUENZA RESPIRATORY VIRUSES (NIRVS)

João Loureiro, Sara Mesquita, Lília Perfeito, Pedro Rio, Eleonora Tulumello, Irma Varela-Lasheras



# Flu season & NIRVs



INSA National flu surveillance program. Season 2018/2019

### **General Objectives:**

- a. Identify different epidemic dynamics.
- **b.** Model dynamics:
  - Estimate the effect of weather or vaccination.
- **c. Test** whether different dynamics lead to differences in reported symptoms.
- **d. Improve** nowcasting models for the flu-NIRVs season





### Data:

- · Epidemiological data: NIRVs positivity rates.
- · Climate data (weighted for population).
- · Symptoms data: Twitter, Google, Influenza Net.

Country	Epidemiological data							
	Frequency	From	Seasons	National data	Regional data	Format		
USA Weekly		16/17	4	hCoVs	hCoVs			
				hMPV	hMPV	% Positive test		
	Weekly			RSV	RSV			
				Adenovirus				
			Parainfluenza					
Canada Weekly		12/14	7	hCoV	hCoV	- % Positive test		
				hMPV	hMPV			
	Maakhy			RSV	RSV			
	vveekiy	13/14		Adenovirus	Adenovirus			
				Parainfluenza	Parainfluenza			
				Entero-rhino virus	Entero-rhino virus			





### **1.** Pattern identification: NIRVs dynamics

### Positivity rates normalized Canada & USA



**1.** SIR epidemiological models





# USING ONLINE BEHAVIOUR TO TRACK DISEASES

David Almeida, Joao Loureiro, Sara Mesquita, Lília Perfeito, Cláudio Haupt Vieira





# 2009 Flu Pandemic - USA



Google searches for "flu" might be driven more by the media than by the disease.



2009 Flu Pandemic







01/20 05/20 08/20 12/20 04/21



### Can we use it to improve prediction?





- X = Linear Regression rerults
- = Random Forest



#### 2009 Flu pandemic

Curating the data improves forecasting, over using all data





# PROTECTING PERSONAL DATA WITH MULTI-PARTY COMPUTATION

Paulo Almeida, Alex Davidson (former member)



# Research with Personal Data

- Privacy
  - GDPR
- Ethics
  - Profiling
  - Societal harm
- Confidentiality
  - Economic interests



#### why am i so

why am i so **tired** why am i so **ugly** why am i so **gassy** why am i so **thirsty** why am i so **angry** why am i so **itchy** why am i so **sad** why am i so **hungry** why am i so **emotional** why am i so **bloated** 

#### how to

how to make slime how to tie a tie how to buy bitcoin how to lose weight how to draw how to draw how to buy ripple how to kiss how to make pancakes how to mine bitcoin how to train your dragon

#### como posso ser

como posso ser amigo de alguem como posso ser feliz como posso ser inteligente como posso ser uma pessoa melhor como posso ser salvo como posso ser rico como posso ser feliz sozinho como posso ser um hacker como posso ser popular no facebook como posso ser cantora

#### como é que se

como é que se beija como é que se diz eu te amo como é que se beija de lingua como é que se engravida como é que se beija na boca como é que se beija pela primeira vez como é que se faz um facebook como é que se faz um relatório como é que se faz panquecas

#### pourquoi je suis

pourquoi je suis moche pourquoi je suis triste pourquoi je suis toujours fatigué pourquoi je suis célibataire pourquoi je suis toujours célibataire pourquoi je suis devenu rebelle pdf pourquoi je suis seule pourquoi je suis toujours fatiguée pourquoi je suis jalouse pourquoi je suis triste sans raison

#### comment faire

comment faire du slime comment faire un cv comment faire des crepes comment faire une dissertation comment faire une capture d'écran comment faire une bibliographie comment faire un gateau comment faire du caramel comment faire de la glue comment faire du pain





Figure 9. Stick men drawn by LOGO programs (from Sussman, 1973)

Thinking: Readings in Cognitive Science, (1978) edited by P. N. Johnson-Laird, P. C. Wason, page 26.





### https://www.nature.com/articles/s41598-017-12961-9



# Solutions

- Homomorphic encryption
- Federated learning
- Differential Privacy
- Synthetic Data
- Multi-party Computation



# **Multi-party Computation**

- Computation of combined data
  - Inputs remain private
  - Processing can be local
  - Different Algorithms (Shamir, Yao)
- Use cases
  - Commodity price setting trusted by all parties
  - Gender gap wage study without revealing salaries
- MPC at SPAC
  - MP-SPDZ library
  - Proof of concept: Docker containers
  - Outreach





Water and steam

power is used to

create mechanical

### From the Industrial Revolution to the Digital Revolution



Electricity lets us

of labor and mass

create a division

Third Fourth
IT systems IoT and cloud
automate technology
production lines automate
further. complex tasks.



Source: https://mjolner.dk/2015/01/14/realizing-the-fourth-industrial-revolution/



### From the Industrial Revolution to the Digital Revolution





# From the Industrial Revolution to the Digital Revolution





# WE NEED A BROAD SOCIETAL DISCUSSION



There are rich and essential parts of human life which are alogical, which are immaterial and non-quantitative in character, and which cannot be seen under the microscope, weighed with the balance, nor caught by the most sensitive microphone.

If science deals with quantitative problems of a purely logical character, if science has no recognition of or concern for value or purpose, how can modern scientific man achieve a balanced good life, in which logic is the companion of beauty, and efficiency is the partner of virtue?

In one sense the answer is very simple: our morals must catch up with our machinery. To state the necessity, however, is not to achieve it.





# Thank you!

# socialcomplexity.eu

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