



## Epidemiology of COVID-19: Studies Needed, Challenges and Opportunities

Marc Lipsitch

University of Stellenbosch

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CENTER for

Communicable

DISEASE DYNAMICS

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## CCDD COVID-19 team

- Bill Hanage •
- Caroline Buckee
- Michael Mina ٠
- Yonatan Grad
- Ed Goldstein •
- Xueting Qiu
- Aimee Taylor
- Mary Bushman ٠
- Rene Niehus
- Pablo M de Salazar
- James Hay
- Stephen Kissler

- Tigist Menkir
- Taylor Chin
- Rebecca Kahn
- Christine Tedijanto
- Nishant Kishore
- Lee Kennedy-Shaffer
- Corey Peak (alum)
- Hsiao-Han Chang (alum)
- Matt Kiang (alum)
- Sarah McGough (alum)
- Francisco Cai (alum)
- Jamie Robins
- Andrea Rotnitzky
- Megan Murray

#### Collaborators

- Caitlin Rivers
- Eric Toner •
- Qi Tan
- Ruoran Li
- Satchit Balsari
- Nick Menzies
- Gabriel Leung
- Joseph Wu
- Kathy Leung
- Ben Cowling
- Lauren Childs (alum)
- Nir Eyal
- Peter Smith •















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PERSPECTIVE

DEFINING THE EPIDEMIOLOGY OF COVID-19

#### **Defining the Epidemiology of Covid-19** — Studies Needed

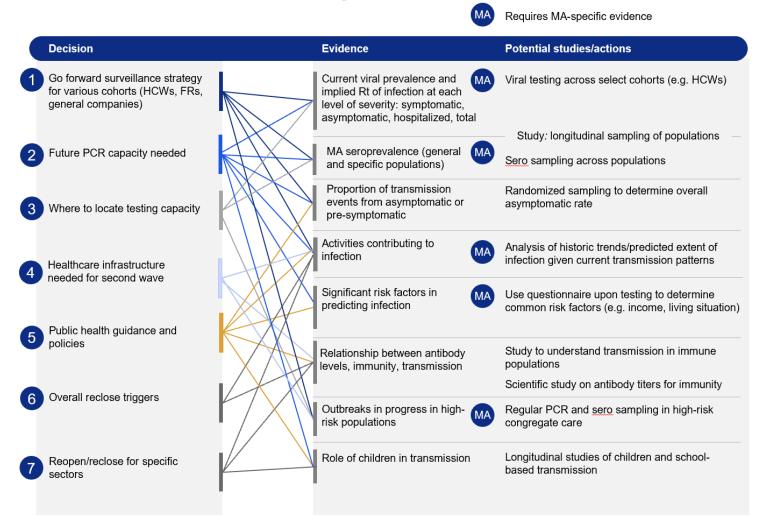
Marc Lipsitch, D.Phil., David L. Swerdlow, M.D., and Lyn Finelli, Dr.P.H.

Types of Evidence Needed for Controlling an Epidemic.		
Evidence Needed	Study Type	
No. of cases, including milder ones	Syndromic surveillance plus targeted viral testing	С
Risk factors and timing of transmission	Household studies	B-
Severity and attack rate	Community studies	В
Severity "pyramid"	Integration of multiple sources and data types	В
Risk factors for infection and severe outcomes, including death	Case-control studies	A-
Infectiousness timing and intensity	Viral shedding studies	B-

Epublished Feb 19

## Epidemiology to inform/ enhance decisions

#### Decisions to be informed by evidence



Massachusetts COVID Command Center

## A theme: Each pandemic is different, with its own data-quality challenges

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- This paper extrapolated lessons from 2009 H1N1
- Many were relevant, but few were directly applicable due to
  - Different virus and testing challenges
  - Different spectrum of illness
  - Different political and institutional context, eg role of CDC in US response



### Number of cases: challenges

 Broad and age-varying spectrum of severity precludes surveillance of one type of case as an indicator

How to maintain surveillance for novel influenza A H1N1 when there are too many cases to count

Lancet 2009

Marc Lipsitch, Frederick G Hayden, Benjamin J Cowling, Gabriel M Leung

- Exacerbated by severe disruptions to the health system that change patterns of care seeking, reduce reliability of traditional indicators (syndromic surveillance, % of visits)
- Hyperpoliticized



#### Syndromic surveillance and targeted viral sampling

Guidance for 2019-nCov surveillance in high burden settings

Due to high burden of infections in some areas, efforts to track most 2019-nCoV cases have become impractical, leading to increasing burden for the public health system and unreliable data. This surveillance guideline was adapted from an article in *Lancet*, 2009 by Prof. Marc Lipsitch, an infectious disease epidemiologist from Harvard, and colleagues.

#### Step 1: Syndromic surveillance

Measure the *incidence of syndromes* that are common presentations of nCoV: acute respiratory infection, influenza-like illness or severe acute respiratory infection.

Collect, count, and report:

1. ILI or ARI outpatient numbers

and

1. SARI and/or pneumonia inpatient numbers

#### Methods:

1. Utilize/improve existing ILI surveillance system

or

2. Repeated population-based surveys by tel/internet/SMS

or

 Enroll a large, geographically dispersed cohort, who report every day/week on symptoms of household members via electronic surveys

#### Step 2: Targeted viral sampling

For a subset of cases of step 1 syndromes, test for nCoV for the purposes of estimating **the attributable fraction of each syndrome that is due to nCoV**.

Collect, count, and report (in sustainable time interval)

 2019-nCov testing for some or all ARI and/or pneumonia inpatients

#### and

2. 2019-nCov testing, and viral sample collection, from all SARI or pneumonia patients in ICU

#### Methods:

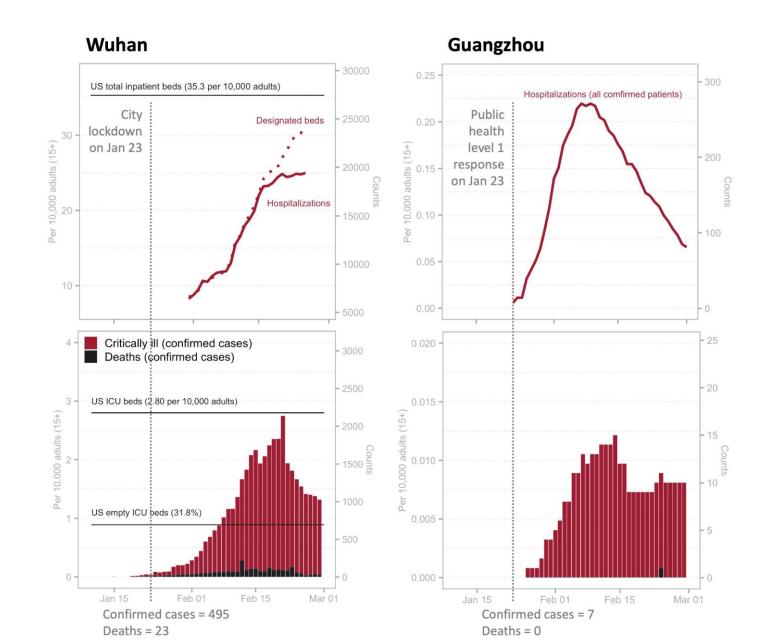
- Ensure specific personnel tasked with collecting, labeling and transporting samples and data and
- If random sample testing cannot be ensured, prespecify standards for testing, e.g. only test deaths/most severe cases, or test one specific ICU every day. Leave little discretion to providers.
- NOTE: Clinical care should not depend on whether a patient is selected for testing

#### Step 3: Estimate of incidence of symptomatic nCoV infection = Syndrome incidence X Attributable fraction of syndrome for nCoV

(Can disaggregate by time, space, population subgroups, and different symptoms)



#### Hospitalized and ICU cases are a lagging indicator due to delays



From R Li et al. JAMA Network Open 2020



## Representativeness: a constant challenge

- Testing is unpleasant enough (serologic or virologic) that many will decline
- Willingness to be tested likely higher among those who suspect they are (or were) sick
- Vocal criticism of individual studies



Medical students, faculty and volunteers take blood samples during a coronavirus antibody study at Mountain View's First Presbyterian Church in Mountain View, Calif. (Ray Chavez/MediaNews Group/The Mercury News/Getty Images)

Scientists feud over hyped Stanford coronavirus antibody study: "The authors owe us all an apology"

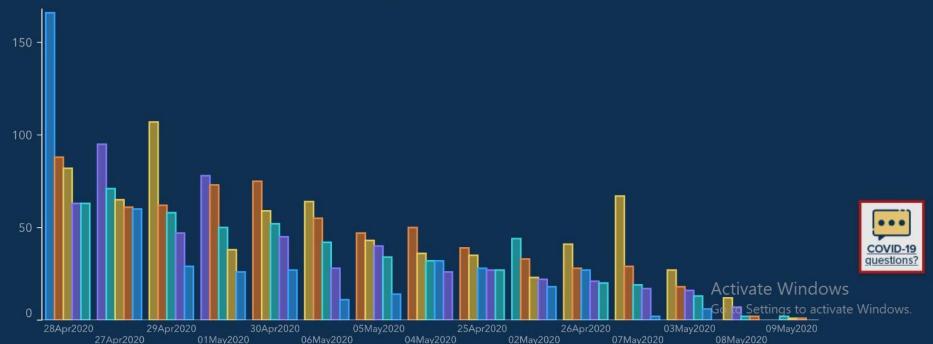


## Politicization

#### Top 5 Counties with the Greatest Number of Confirmed COVID-19 Cases

The chart below represents the most impacted counties over the past 15 days and the number of cases over time. The table below also represents the number of deaths and hospitalizations in each of those impacted counties.

County Cobb DeKalb Fulton Gwinnett Hall





Q Popular Latest

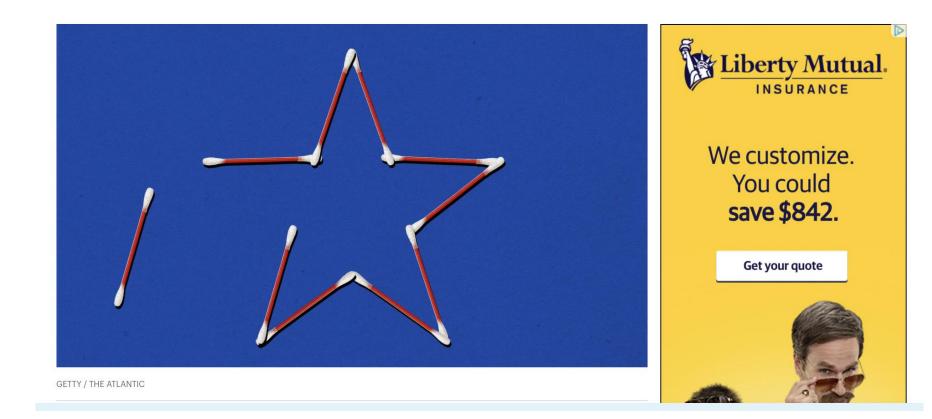
The Atlantic

Sign In

#### How Virginia Juked Its COVID-19 Statistics

The state is combining results from viral and antibody tests in the same statistic. This threatens to confound America's understanding of the pandemic.

ALEXIS C. MADRIGAL AND ROBINSON MEYER MAY 13, 2020





## **Opportunities** to improve case counting

- Prevalence and seroprevalence testing in representative populations
  - Probability sample: national statistical agency (Spain, UK)
  - Virus testing of delivering mothers and infant dried blood spots for maternal serology
  - For health care delivery that is still functioning, testing of those coming in for non-COVID complaints (eg all admissions to hospital, all emergency visits, etc)
  - No good solution to how to get absolute case numbers, but at least relative to determine trend of the epidemic.



## Maternal testing at NYC hospitals

Maternal virus prevalence

Reduction in movement Correlation



Kissler et al. 2020 https://dash.harvard.edu/handle/1/42665370 preprint

## Risk factors and timing of transmission: Challenges

- Variable symptom profile and natural history makes contact tracing hard
- Common symptoms:
  - Fever
  - Dry cough
  - Fatigue

• Less common symptoms:

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- Aches and pains
- Sore throat
- Diarrhoea
- Conjunctivitis
- Headache
- Loss of taste or smell
- Rash or discoloration

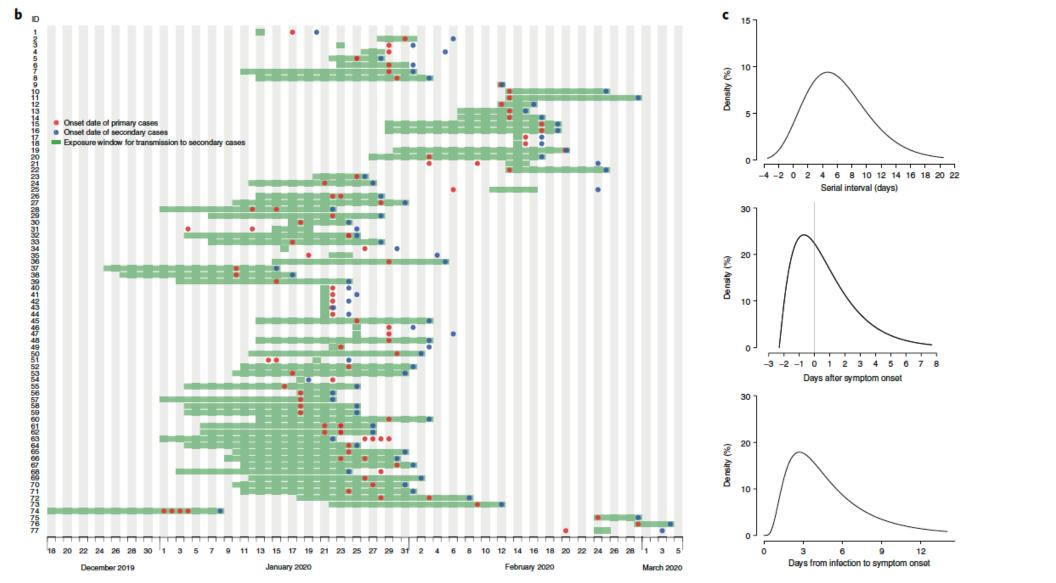
- Severe symptoms:
  - Difficulty breathing, shortness of breath
  - Chest pain or pressure
  - Loss of movement or speech



He et al.

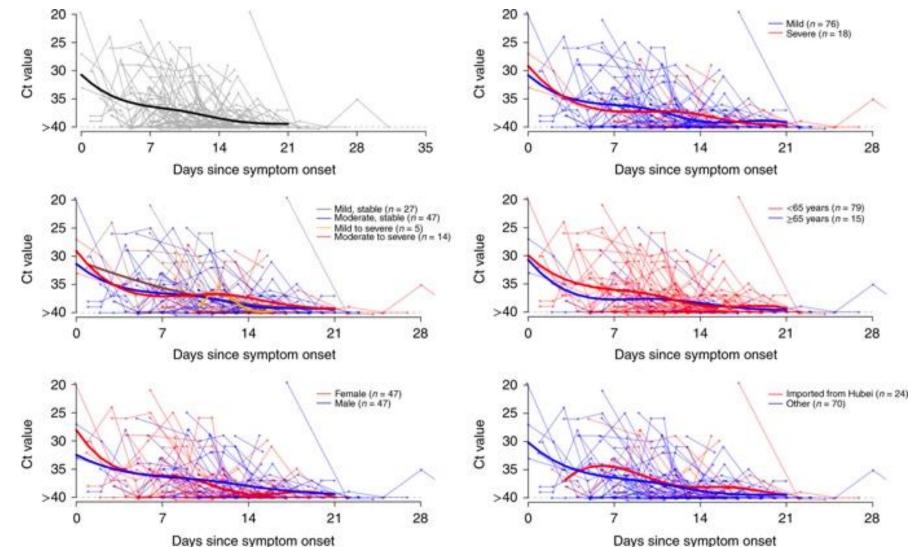
Nature Med 2020

#### Presymptomatic transmission common





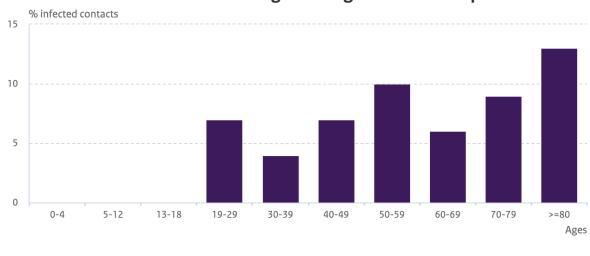
## Timing of shedding



He et al. Nature Med 2020

## Risk factors for transmission still poorly defined, specifically age

- Likely highly contextual
- Role of children as transmitters is key for school opening, but poorly known.



#### Infected contacts according to the age of the source patient $\equiv$

Percentage positive contacts

NL RIVM https://www.rivm.nl/en/novel-coronavirus-covid-19/children-and-covid-19

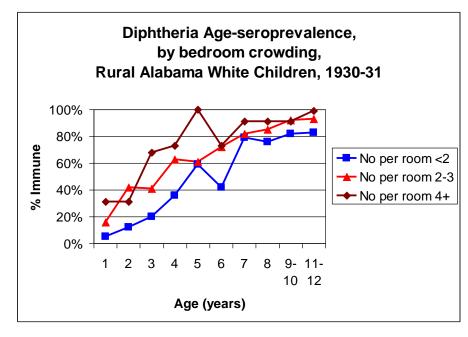
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## **Opportunities:** Social seroepidemiology

#### RESEARCH ARTICLE

Human *Trypanosoma cruzi* infection is driven by eco-social interactions in rural communities of the Argentine Chaco

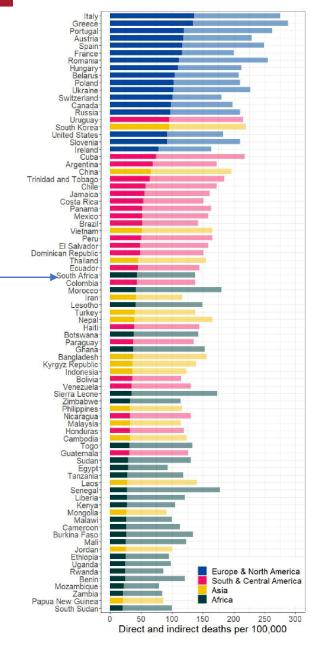
Maria del Pilar Fernández 6<sup>1,2,3</sup>\*, Maria Sol Gaspe<sup>1,2</sup>, Paula Sartor<sup>1,4,5</sup>, Ricardo E. Gürtler<sup>1,2</sup>



From: OL Chason, DPH Thesis, HSPH, 1933. Diphtheria Immunity in Rural Alabama: A survey of social conditions, environment, and Schick Test Results

- Poverty, race associated with bad outcomes and with infection risk
- We don't know why
  - Just outcomes, or also infection?
  - Preexisting medical conditions?
  - "social distancing is a luxury":
    - Household crowding/challenge in distancing?
    - · Having to work outside the home
  - Public transport?
- Good social epidemiology on causal risk factors for seropositivity much needed!
- Informs interventions!

#### Opportunities: Local patterns may vary with demography, coresidence patterns



Esteve et al Medrxiv

https://www.medrxiv.org/content/10.1101/2020.05.13.20100289v1

Figure 1. Covid-19 vulnerability to national age and co-residence patterns.

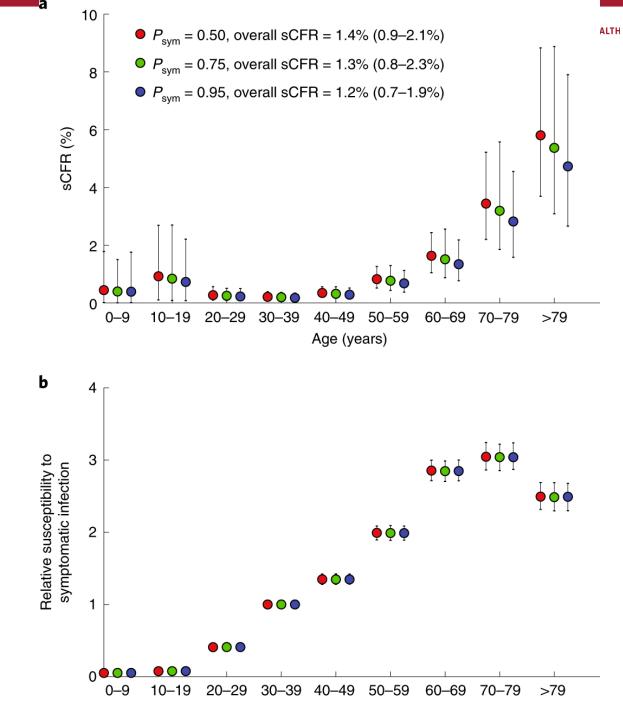
Estimated number of direct (dark) and indirect (light) deaths per 100,000 individuals if 10% of the population living in private households were to be infected by covid-19 at random.



## Severity

•••• Center *for* Communicable Disease Dynamics

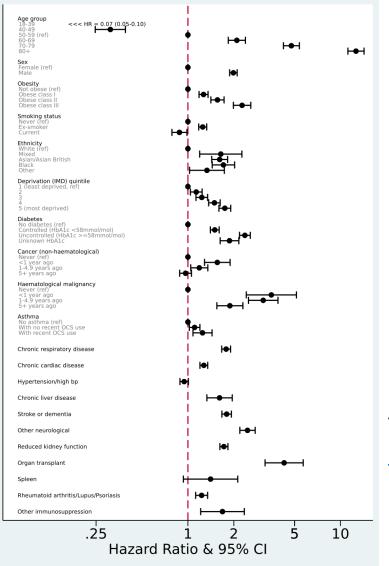
#### Case-Fatality Ratio among Symptomatics (sCFR) increases dramatically with age



JT Wu et al. Nature Med 2020

Age (years)

### Mortality risk depends on many factors

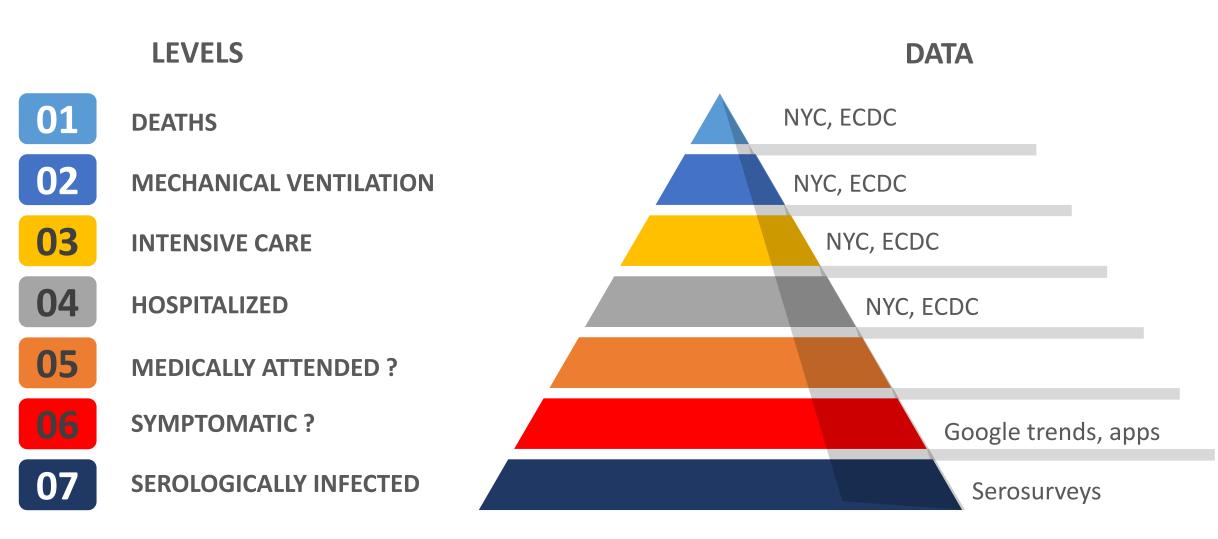


#### The OpenSAFELY Collaborative

https://www.medrxiv.org/content/10.1101/2020.05.06.20092999v2



## **COVID 19 Severity Pyramid**



K Joshi and R Niehus



## Serological base

•••• CENTER *for* COMMUNICABLE DISEASE DYNAMICS

#### Seroepidemiology for estimating herd immunity The New Hork Times

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#### Nearly a third of 200 blood samples taken in Chelsea show exposure to coronavirus

Mass. General researcher says the results point to a 'raging epidemic,' but may also indicate the city is further along the disease curve than some other municipalities By Jonathan Saltzman Globe Staff, Updated April 17, 2020, 6:26 p.m.

- ✓ Great geographic variation
- ✓ High disease reflects high infection burden
- ✓ Much undetected infection
- $\checkmark$  A little nonspecificity can ruin a study
- ✓ Need expert statistical input
- ✓ Hazards of overinterpretation

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#### 1 in 5 New Yorkers May Have Had Covid-19, Antibody Tests Suggest

Accurate antibody testing is a critical tool to determine if the pandemic has slowed enough to begin restarting the economy.



teers take blood samples during a coronavirus antibody study at Mountain View's First Presbyterian Church in Mountain View, Calif. (Ray Chavez/MediaNews Group/The Mercury News/Getty Images)

Scientists feud over hyped Stanford coronavirus antibody study: "The authors owe us all an apology"

## Infection-fatality rate

G Meyerowitz-Katz et al. https://www.medrxiv.org/content/10.1101/2020. 05.03.20089854v1.full.pdf

#### Meta-analysis of infection fatality rates of COVID-19 as of research published by 28/04/2020

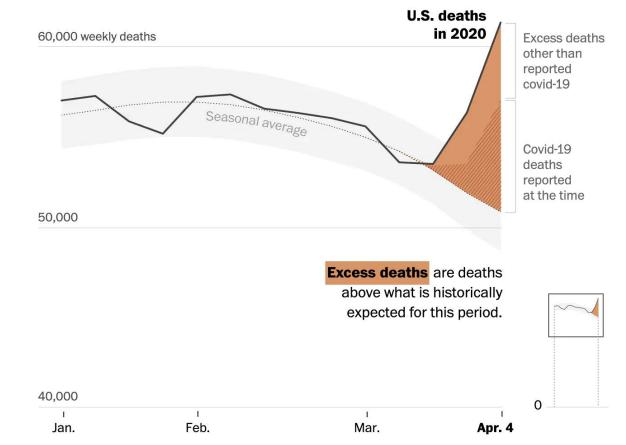
Study	Month		ES (95% CI)	% Weight
Sludy	Monut		L3 (93% CI)	vveign
Modelling				
Jung et al	Feb		0.70 (0.18, 1.22)	7.06
CEBM	March	-	0.20 (0.10, 0.36)	9.55
Ferguson et al	March		1.00 (0.38, 1.62)	6.31
Nishiura et al	Feb	-	0.45 (0.36, 0.54)	9.67
Subtotal (I-squ	ared = 79.8%, p = 0.002)		0.45 (0.22, 0.69)	32.60
Observational				
Tian et al	Feb		1.15 (0.00, 2.43)	3.12
Verity et al	March	•	0.66 (0.60, 0.72)	9.74
Russell et al	March		- 0.60 (0.20, 1.30)	6.81
Bendavid et al	April	•	0.20 (0.16, 0.24)	9.76
Subtotal (I-squ	ared = 98.1%, p = 0.000)	$\langle \rangle$	0.52 (0.14, 0.90)	29.42
Preprint				
New York City	April	•	0.93 (0.91, 0.94)	9.78
Rinaldi et al	April		<ul> <li>1.29 (0.89, 2.01)</li> </ul>	6.73
Roques et al	April		0.80 (0.45, 1.25)	7.95
Villa et al	April	-	<b>1</b> .60 (1.10, 2.10)	7.19
Modi et al	April		0.95 (0.47, 1.70)	6.33
Subtotal (I-squ	ared = 55.1%, p = 0.063)		> 1.06 (0.81, 1.30)	37.98
Overall (I-squa	red = 99.1%, p = 0.000)		0.75 (0.49, 1.01)	100.00
	are from random effects analysis			
			I	
	-2.43	0	2.43	

D Weinberger

Washington Post

Yale SPH

#### Undetected deaths/collateral damage



Sources: Overall death data comes from the National Center for Health Statistics, covid-19 death counts come from state health departments and are compiled by The Washington Post, and estimates for expected deaths come from Yale School of Public Health's Modeling Unit.



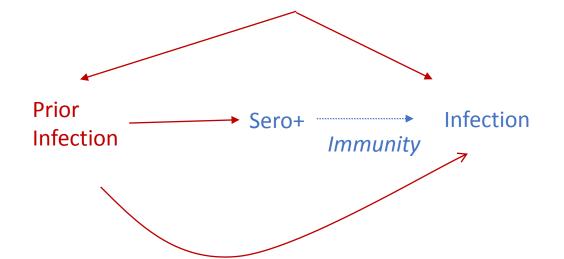
## **Opportunities:** severity

- Role of biological age vs exposures esp. those rare in US, China, Europe – explore risk factors in younger populations
- Use of DSS to capture outcomes



## Seroprotection: Does antibody indicate immunity to infection? Which? How much?

- Hard study to do
- Confounding is rampant



Housing density, PPE, genes, occupation, local incidence, etc etc

• Want biological effect only

- Must ensure comparability of sero+ and sero-
  - HCW studies may be optimal
  - Choice of comparators in cohort studies with similar geographic, SES, and occ exposures

Kahn, Kennedy-Shaffer, Robins, Lipsitch

Behavior (risk compensation)

https://www.medrxiv.org/content/10.1101/2020.05.02.20088765v1

Halloran *et al. BMC Medicine* (2017) 15:223 DOI 10.1186/s12916-017-0985-3

**BMC** Medicine

#### OPINION

**Open Access** 

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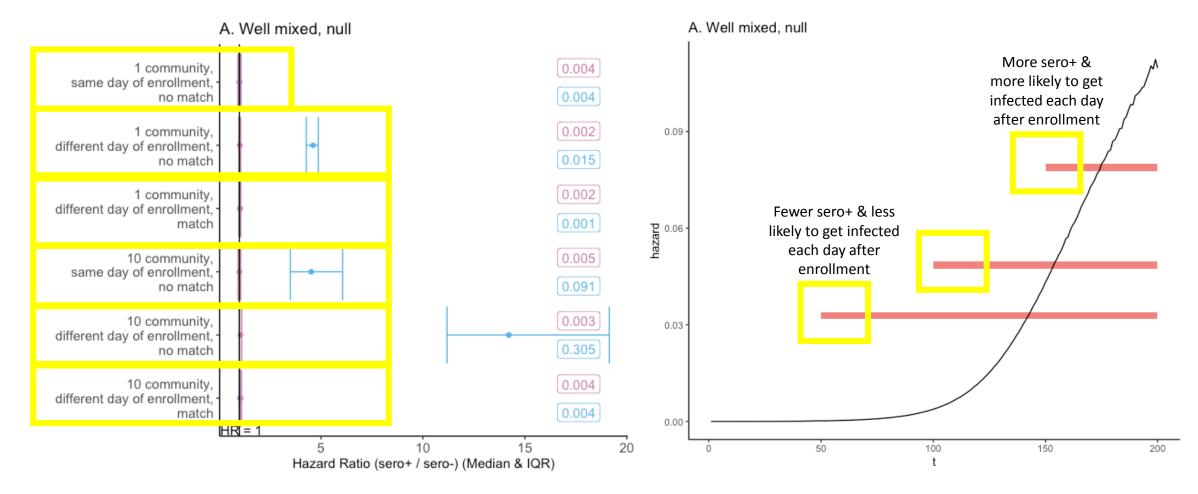
## Simulations for designing and interpreting intervention trials in infectious diseases

M. Elizabeth Halloran<sup>1,2\*</sup>, Kari Auranen<sup>3</sup>, Sarah Baird<sup>4</sup>, Nicole E. Basta<sup>5</sup>, Steven E. Bellan<sup>6</sup>, Ron Brookmeyer<sup>7</sup>, Ben S. Cooper<sup>8</sup>, Victor DeGruttola<sup>9</sup>, James P. Hughes<sup>2</sup>, Justin Lessler<sup>10</sup>, Eric T. Lofgren<sup>11</sup>, Ira M. Longini<sup>12</sup>, Jukka-Pekka Onnela<sup>9</sup>, Berk Özler<sup>13</sup>, George R. Seage<sup>14</sup>, Thomas A. Smith<sup>15,16</sup>, Alessandro Vespignani<sup>17</sup>, Emilia Vynnycky<sup>18,19</sup> and Marc Lipsitch<sup>14</sup>

#### And observartional studies!



## Well mixed, no control, null (HR =1)





## Other potential biases

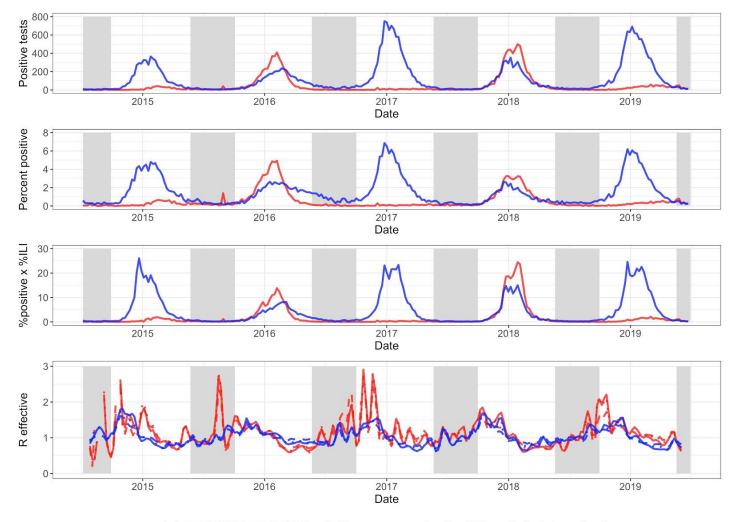
- From epidemic dynamics
  - Clustering within communities: network effects induce confounding between past and future risk of infection
- From other effects
  - Simple differential exposure (occupation, household density, PPE for HCW, etc)
  - Risk compensation







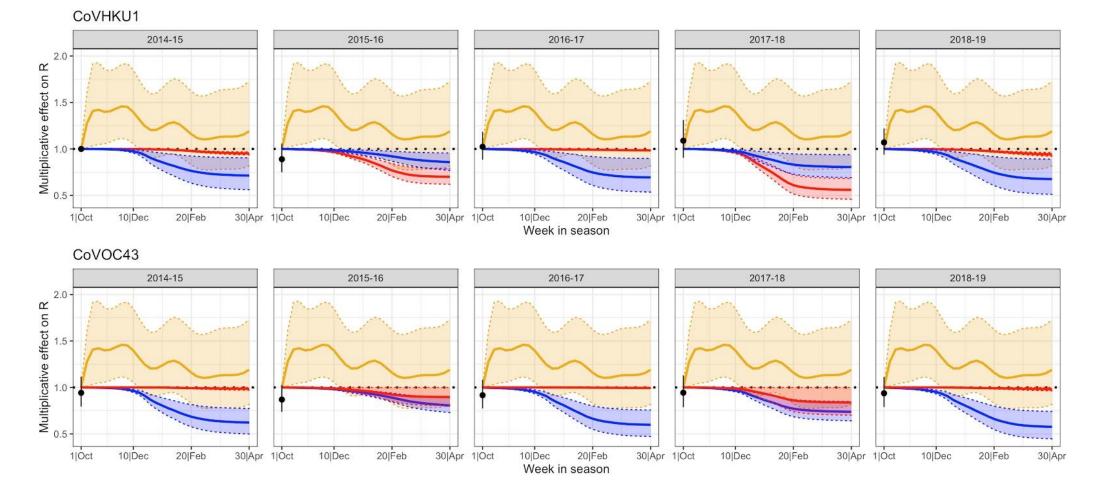
#### Beta coronavirus incidence in the US



strain — CoVHKU1 — CoVOC43 Incidence proxy — %positive x %ILI · Positive tests — %positive



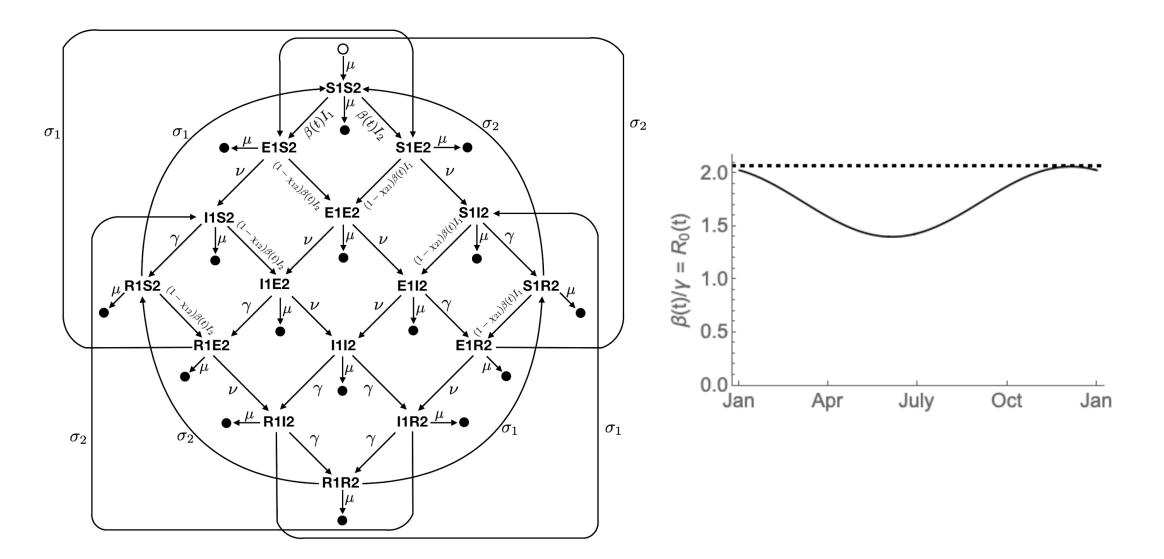
## Decomposing R<sub>e</sub>



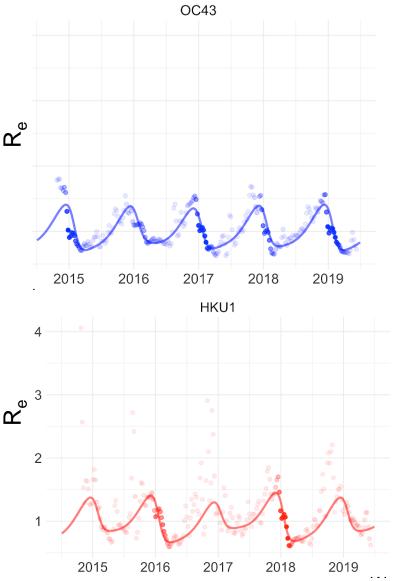
 $log(R_{sij}) = log(R_0S_0) + \alpha_{sj} + \lambda_s d_{sij} + \delta_s d_{rij} + \sum_{n=1}^{10} \theta_n B_n(i) + \epsilon_{sij}$ 



### **Transmission model**



#### Model fit $\mathbf{R}_{\mathbf{e}}$ % positive x % ILI % 0.2 OC43 HKU1 \_ \_ 2015 Actual \_ 4 Simulated - -م <sup>ع</sup> 0.0 2 2019 2015 2016 2017 2018 Year





### Seasonality of betacoronaviruses

- 21% best fit amplitude of seasonal forcing
- Rest is accounted for by depletion of susceptibles
- This would not be enough alone to control SARS-CoV-2 in summer
- Limitations: incidence proxy, national data, lack of mechanism, not the same virus!



# Other work uses less reliable but more relevant data on SARS-CoV-2 and reaches similar conclusions

Ultraviolet radiation decreases COVID-19 growth rates:

Global causal estimates and seasonal implications

Tamma Carleton, Jules Cornetet, Peter Huybers, Kyle C. Meng, and Jonathan Proctor\*

This version: May 15, 2020 First version: April 20, 2020

#### The role of environmental factors on transmission rates of the COVID-19 outbreak: An initial assessment in two spatial scales.

Canelle Poirier<sup>1,2</sup>, Wei Luo<sup>1,2</sup>, Maimuna S. Majumder<sup>1,2</sup>, Dianbo Liu<sup>1,2</sup>, Kenneth D. Mandl<sup>1,2,3</sup>, Todd A. Mooring<sup>4</sup>, Mauricio Santillana<sup>1,2,5,\*</sup>



## Conclusions

- Much has been learned about the basic properties: this is a very hard virus to control due to variable clinical spectrum and high infectiousness early.
- Social factors affect infection risk, outcome. Need far more information on this in each part of the world.
- Some key issues we did not highlight in Feb (seasonality, seroprotection) are highly important
- Representative sampling is a repeated challenge
- Opportunities for comparison across countries and regions to understand risk predictors better.