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#### Unpacking the Drop in COVID-19 Case Fatality Rates: A Study of National and Florida Line-Level Data

From Phenotyping to Risk Prediction

Session 61

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Our research team has no relevant relationships with commercial interests to disclose.



After participating in this session the learner should be better able to:

- Understand the **limitations of using the aggregate case fatality rate** when assessing the efficacy of treatment improvements
- Account for confounding factors such as shifting age distributions, increased testing, and lags between detection and death
- Understand how to use and interpret our publicly released web tool to apply our analyses to any demographic of interest.





Over the past 1.5 years, the coronavirus pandemic has continually evolved



Decision makers face key questions:

- Has treatment improved outcomes?
- Is **fatality** decreasing?
- Infection rate at current vs. previous dates? Artifacts of expanded testing?







- CFR = # of deaths due to covid / # of covid cases
- Between the first and second peaks, >70% drop in CFR
- Focus of this study: April 2020 December 2020
- **Driving Question:** What explains the movement (& apparent overall decline) in the CFR over the course of the COVID-19 pandemic?



Press briefing by former President Donald Trump (July 27):

**"Due to the medical advances** we've already achieved and our increased knowledge in how to treat the virus, the **mortality rate** for patients over the age of 18 is **85 percent lower** than it was in April."

This statement was about the **aggregate CFR**.

Can we really say that **treatment** caused the 85% drop in CFR?  $\rightarrow$  According to our analysis, no.

### What explains the drop in CFR?



Academic & public discourse has centered around the following hypotheses:

could misinform policy decisions

(H1) Shifting age distribution

(H2) Increasing testing capacity

(H3) Delay between detection and fatality

(H4) Treatment improvements

(H5) Disease mutation

(H6) Reduced viral load due to precautions

reasonable grounds for policy (e.g. re-opening)



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#### Contributions

- Demonstrate how H1, H2, and H3 ("artifacts") can be accounted for when attempting to quantify improvements in treatment (H4)
- Age-stratified hospitalization data is key
- Analyze data over a longer time range and larger scale than prior work
  - 9-month time period (April 2020 December 2020)
  - **State-level** data from the FDOH (1 million cases, 57K hospitalizations)
  - **National** data from the CDC (10.3 million cases, 588K hospitalizations)
  - Data characteristics: line-level, date of detection, age, gender, hospitalized or died
- Publish a **web tool** for users to apply our analyses to selected demographics, regions, and dates of interest



### Methods – Accounting for "Artifacts"



We use 7-day lagged averages to reduce noise in time series.

We establish and account for:

- **Increased testing (H1):** examine *hospitalization fatality rates (HFR)*
- Age distribution shifts (H2): stratify by age groups 0-9, 10-19, ..., 80+
- **Delays between detection and fatality (H3):** use line-level data for a *cohort-based analysis*, so fatality matches up with the right individual
  - Cohort-based fatality rate definition:

 $HFR_{t} = \frac{\text{cases confirmed (or reported) at day } t \text{ that eventually get hospitalized and die}}{\text{cases confirmed (or reported) at day } t \text{ that eventually get hospitalized}}$ 

#### Methods – Quantifying True Improvements

- Quantify the change in age-stratified HFR
- Cubic splines: estimate the underlying trend
- Block-bootstrapping with post-blackening (Davison and Hinkley 1997): estimate uncertainty around this trend
- Rather than fitting a predictive model for forecasting, we **estimate** the existing trends in HFR at all points in time



## **Results – Increased Testing (H2)**





- April to December: testing increases significantly
- Positive test rates spike in April, July, and December
- Although spikes in tests could inflate case counts, there are also large spikes in positive test rates

### **Results - Cases, Hospitalizations, Deaths**



#### Florida FDOH Data



#### **U.S. CDC Data**



### **Results – Demographic Shift (H1)**





### **Results – Avg. Change in Estimated HFR**



#### **1<sup>st</sup> & 2<sup>nd</sup> Peak dates** (April 15<sup>th</sup> – July 15<sup>th</sup>)

Entire study time range (April 1<sup>st</sup> – December 1<sup>st</sup>)

Age	Florida	National	Age	Florida	National
aggregate	-2.3%	-41%	aggregate	-33%	-61%
20-29	-	-34%	20-29	-	-73%
30-39	-	-37%	30-39	-	-61%
40-49	-	-29%	40-49	-	-65%
50-59	+12%	-31%	50-59	-	-63%
60-69	+13%	-30%	60-69	-42%	-61%
70-79	+3.4%	-34%	70-79	-38%	-60%
80+	+2.9%	-27%	80+	-17%	-55%

#### Conclusions



- Unpacked the "improvement" in CFR, honing in on improvements reasonably attributable to advances in treatment
- Account for:
  - shifting age distributions → by **age-stratifying**
  - increased testing capacity  $\rightarrow$  by focusing on the **hospitalized**
  - delay between detection & fatality  $\rightarrow$  by doing **cohort-based** analysis
- We recommend policy-makers account for at least these three factors
- Coming back to Trump's statement in July...
  - age-stratified HFR had actually *increased* in Florida
  - nationally, the drop in HFR was at most 41%
- Customizable web tool

#### Web Tool



ender (for both Florida and national)	Race (for national only)		State (for national only)		
All	× ·	× *	All		
► Florida					
▼ National					
Cases	Hospitalizations		Deaths		
0,4 0,2 0,4 0,2 0,4 0,4 0,2 0,4 0,4 0,2 0,4 0,4 0,4 0,4 0,4 0,4 0,4 0,4 0,4 0,4	0.8 97 0.6 0.4 0.2 0 4/b/3/y/k//B/B/B/d/O/seb/f/s/B/3/ 2/02	Age Group 6 60-69 6 60-69 6 0-59 6 0-59 6 0-59 6 0-59 6 0-59 8	1 0.8 0.6 0.4 0.4 0.2 0 4/http/h/A/g8g2/t402e1a/f8tha/http/h/A/ 2020	Age Group 0 20-79 0 0-60 30-59 0 40-49 30-39 0 20-29 0-9 0-9	
CDC Report Date	CDC Report Date	CDC Report Date		CDC Report Date	
ge-stratified HFR Estimates Choose two dates for estimating HFR drops: $04/01/2020 \rightarrow 12/01/2020$					
Gender (for both Florida and national)	Race (for national only)		State (for national only)		
All	× ▼ All	× *	All	×	
Florida		National			



# Thank you!

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