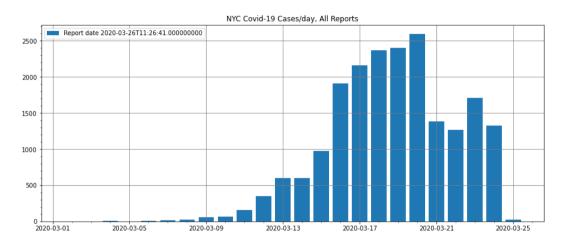
# COVID-19: THE DATA ABUSE PANDEMIC

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Bloomberg Quant Seminar May, 2020 DRAFT SLIDES

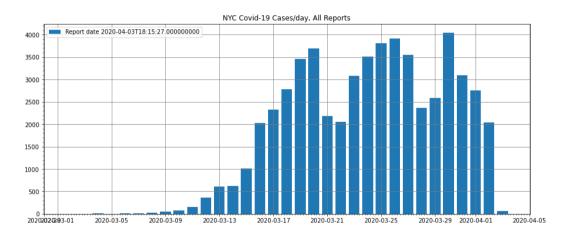
# WHAT THEY FIRST SHOWED IN NYC



# Looks like cases/day are dropping off after 3/20

DRAFT 2/15

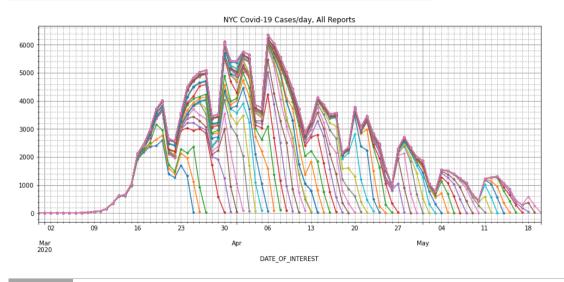
# **EIGHT DAYS LATER**



Now it looks like it didn't drop off after 3/20!

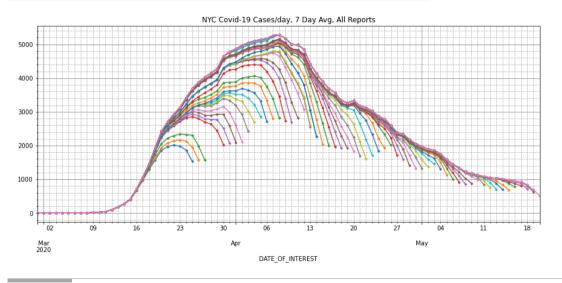
DRAFT 3/15

# WHAT THEY DIDN'T SAY



DRAFT 4/1

# AFTER APPROPRIATE SMOOTHING



DRAFT 5/

# **ABUSES**

#### What's going on?

Different sites report cases at different times

#### Impact:

- Reporting delays can account for 30% changes as much as 3 weeks later
- Latest counts for each date are reported history is harder to extract
- Low weekend counts obscure trends
- Reporting aggregates instead of per site data makes analysis difficult

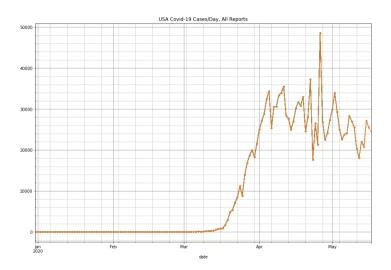
#### But this is the good case!

#### See:

- COVID-19 NYC Stats A Ray Of Hope [Ste20d]
- COVID-19 NYC Stats Not What They Seem [Ste20e]

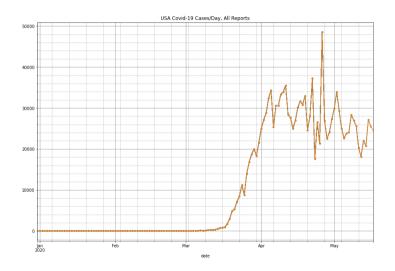
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# WHAT THEY SAID FOR THE USA



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# WHAT THEY DIDN'T SAY



DRAFT 8/

#### **ABUSES**

#### What's going on?

Recording by report date instead of by incident date!

#### Impact:

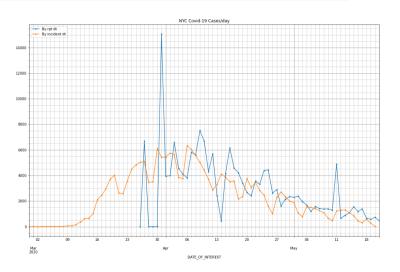
- No record of when incidents actually occurred
- Misstates ramp up to peak, delays peak and overstates post-peak incidents
- Obscures periodicity and adds noise
- Makes modeling harder and more error prone
- News reports of yesterday's numbers are deceptive

#### Recording by report date is rampant – all major sources do it:

- Our World in Data repository (data from the European CDC)
- Johns Hopkins University COVID-19 repository
- ► New York Times COVID-19 repository

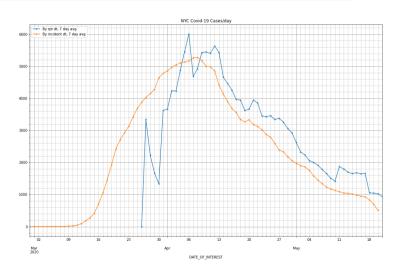
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# **IMPACT**



DRAFT 10/15

# **IMPACT**



DRAFT 11/1

# **SUMMARY**

#### What now?

- ► Know your data!
- Be aware that recent reports are inaccurate either missing data or misrepresenting counts
- Account for this in your modeling
- Ask data sources to collect by incident date, publish full history and publish per site data instead of aggregating
- ► Investigate actual meaning of data classification of COVID-19 hospitalizations, deaths due to COVID-19, ...

See COVID-19 Data Collection - Garbage In, Garbage Out [Ste20c])

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# References

- [Joh20] Johns Hopkins University. Novel Coronavirus (COVID-19) Cases, provided by JHU CSSE. 2020. URL: https://github.com/CSSEGISandData/COVID-19.
- [New20a] New York City. NYC Health Coronavirus Data. 2020. URL: https://github.com/nychealth/coronavirus-data.
- [New20b] New York Times. An ongoing repository of data on coronavirus cases and deaths in the U.S.. 2020. URL: https://github.com/nytimes/covid-19-data.

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- [OWI20] OWID. Data on COVID-19 (coronavirus) confirmed cases, deaths, and tests, All countries, Updated daily by Our World in Data. 2020. URL: https://github.com/owid/covid-19-data.
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- [Ste20b] Harvey Stein. Analysis of Our World of Data's COVID-19 dataset. Fork of https://github.com/owid/covid-19-data. 2020. URL: https://github.com/hjstein/covid-19-data.
- [Ste20c] Harvey Stein. COVID-19 Data Collection Garbage In, Garbage Out.

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- [Ste20e] Harvey Stein. COVID-19 NYC Stats Not What They Seem. Blog, Harvey J. Stein, Essays and commentary from a member of the quantitative community. Apr. 2020. URL: https://hjstein.blogspot.com/2020/04/covid-19-nyc-stats-not-what-they-seem.html.

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