# CoDatMo: Creating a Common Epidemiological Framework with Bayesian Models

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#### Who

- Breck Baldwin: Project Manager Laplace Lab @Columbia statistics
- Andrew Gelman: @Columbia statistics
- Simon Maskell: PI Big Hypotheses Lab at U of Liverpool
- Conor Rosato, Lee Delvin, John Heap, Philip Clemson, Allesandro Varsi, Matthew Carter, Robert Moore, Vincent Beraud, Al Philips, Kelli Casidy, Jose Storypoli, Alessandra Pellini, Elias Noda, Bob Carpenter

#### How

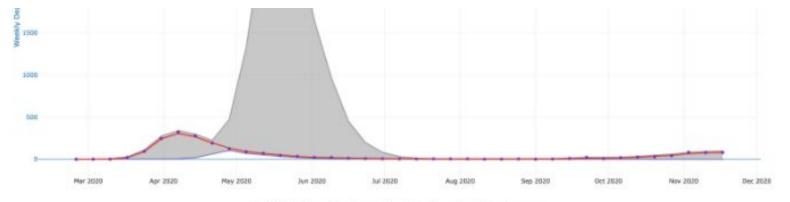
- UKRI Big Hypotheses EP/R018537/1
- NSF RAPID grant 2055251

### Outline

- Overview CoDatMo
- Brief intro to Bayesian Modeling and Stan
- Go over some repositories
- Resources

### CoDatMo Goals and History

- 1. August 2020:
  - a. Stan--a popular language for modeling COVID-19 epidemiology ~ 20 models
  - b. The UK Joint Biosecurity Center (JBC) uses many models but similarities/differences
  - c. Liverpool/Columbia decide to create an online resource for comparative COVID modeling
    - i. Improve the models
    - ii Share ideas
- 2. November 15, 2020: NSF RAPID grant 2055251 for COVID awarded
- 3. December 2, 2020: <a href="https://github.com/codatmo">https://github.com/codatmo</a> up and running
  - a. Model example
  - b. Data
- Submissions:
  - a. December 2, 2020: Liverpool
  - b. December 8, 2020: Ye Old Lancaster
  - c. December 20, 2020: Simple SIR
  - d. .....Rethinking appeal of CoDatMo to external contributors
  - e. March 14, 2020: UNINOVE Sao Paulo
- 5. April 14, 2020: This presentation



Death incidence in nhs sandwell and west birmingham ccg

home about

#### Welcome to the CoDatMo site

CoDatMo (COvid DATa MOdel) exists to replicate and host COVID-19 models written in the Bayesian modeling languages like Stan or PyMC. The goals include:

- Reproduce COVID-19 models with an eye to:
  - Get the word out on important COVID-19 models by offering well documented examples approachable by statiticians, programmers and researchers.
  - Increase the impact of the original researchers and get them additional exposure.
  - Help researchers improve their models via the replication process
- Provide a common language for implementing various models.
- Facillitate information exchange between model developers.
- Provide public access to models.

#### CombineR

BSD-3-Clause \$°0 ₩0 ① 0 17 0 Updated 4 hours ago

#### UNINOVE\_Sao\_Paulo

Covid Modeling work at UNINOVE Brazil

170 (1) 0 Updated 3 days ago

#### Data

Collection of open-source data sources for the United Kingdom and the rest of the world. To be used for testing of the various models.

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### Liverpool

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#### Top languages

HTML R Stan

#### People



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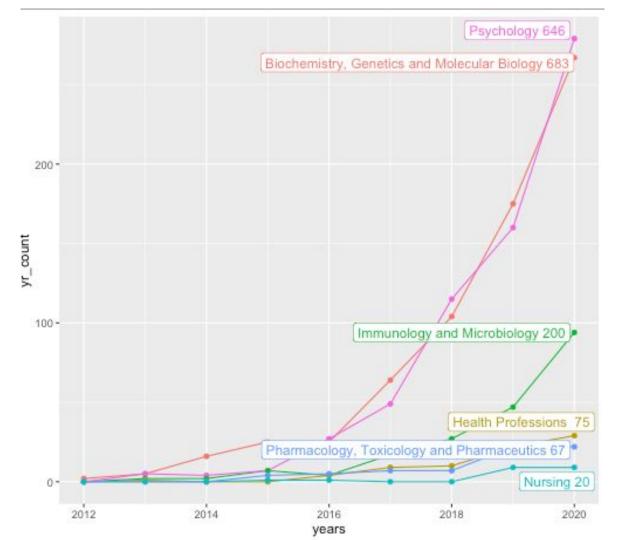




Invite someone

## Over 50 models for COVID-19 written in Stan: Why?

- Hierarchical models
- Noise tolerant models with small to medium data sets
- Lots of room for integration of prior knowledge
- Can be very interpretable models to support counterfactual reasoning etc...
- Very robust uncertainty handling
- Huge effort on inference safety
  - Bayesian workflow
  - Inference diagnostics
  - Self monitoring gradient crawler
- Generative models
  - Mechanistic
  - Human interpretable
  - Simulation



## **Deep Learning**

## Repos in CoDatMo

https://codatmo.github.io/Simple SIR/

https://github.com/codatmo/UNINOVE\_Sao\_Paulo

### Resources

- Codatmo project: <a href="https://codatmo.github.com">https://codatmo.github.com</a>
  - Help us...
  - Let us help you...
- Slides: https://github.com/codatmo/documentation/blob/main/talks/CovidSymp\_4\_16\_2021.pdf
- Modern Bayesian modeling packages:
  - Stan: https://mc-stan.org
    - R, Python, Scala, .... https://mc-stan.org/users/interfaces/
    - High level interfaces in Ime4 tradition (R only)
      - brms: https://paul-buerkner.github.io/brms/
      - RStanArm: https://mc-stan.org/rstanarm/
  - PyMC Python HMC/NUTS: https://pypi.org/project/pymc/
  - TensorFlow/PyTorch
- Statistical Rethinking, Second Edition, by Richard McElreath
  - Youtube lectures https://youtube.com/playlist?list=PLDcUM9US4XdNM4Edgs7weiylguLSToZRI
  - brms implementation of 1st Edition at: https://bookdown.org/content/4857/
- Bayesian Statistics for the Social Sciences GR5065 in http://www.qmss.columbia.edu/:
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