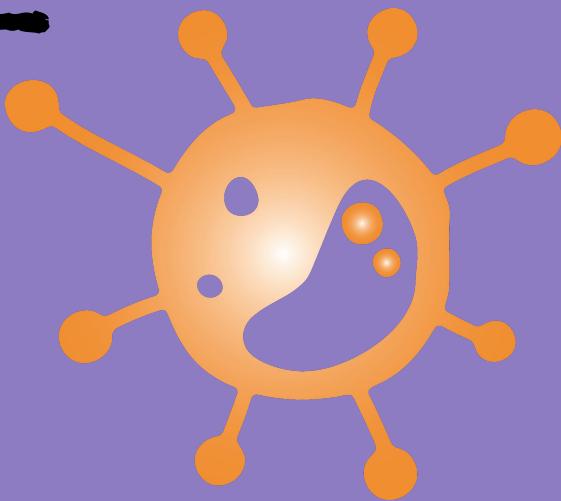


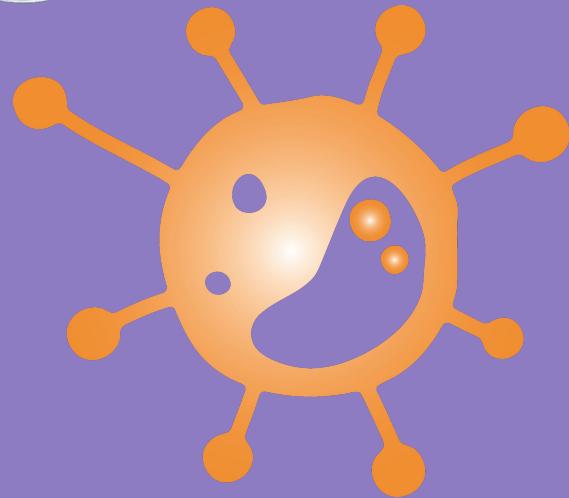
# Mathematical Modeling of Disease - COVID19

Presented by Theo N.



# Assumptions

“All models are wrong - some are just useful” -  
George E.P. Box



# Knowledge

Bloomberg

World

Jan. 29, 2020

**10-Year-Old Boy Raises Fears Wuhan Virus Could Spread Undetected**

Business

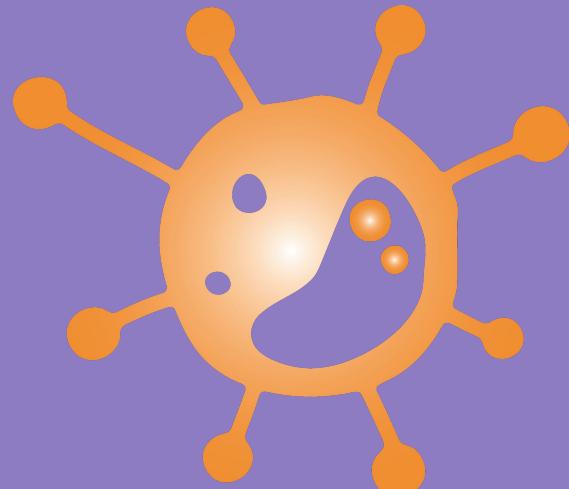
Mar. 4, 2020

**New York Coronavirus Case Spurs Complex Risk Calculus**

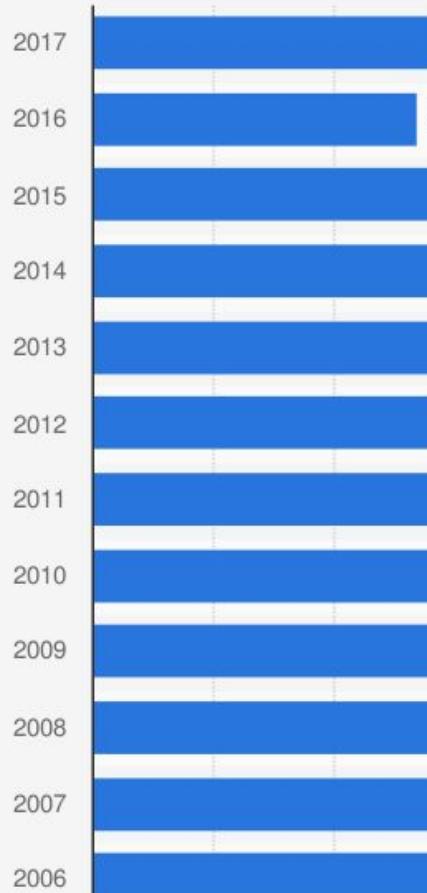
In South Korea, A Growing Number Of COVID-19 Patients Test Positive After Recovery      Apr. 17, 2020 - NPR

April 17, 2020 · 11:23 AM ET

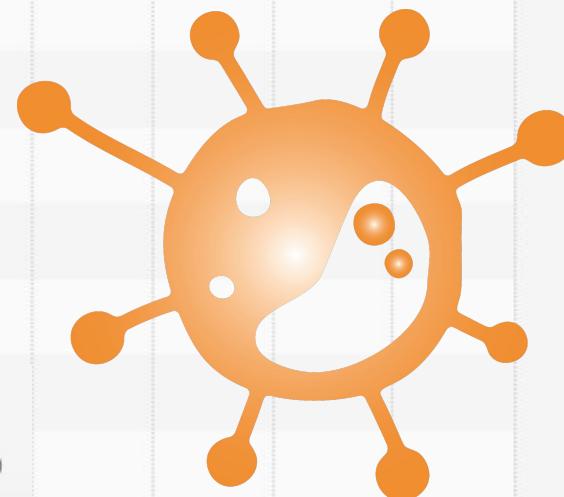
April 18,  
2020



# Deaths by influenza and pneumonia in the U.S. from 1950 to 2017 (per 100,000 population)

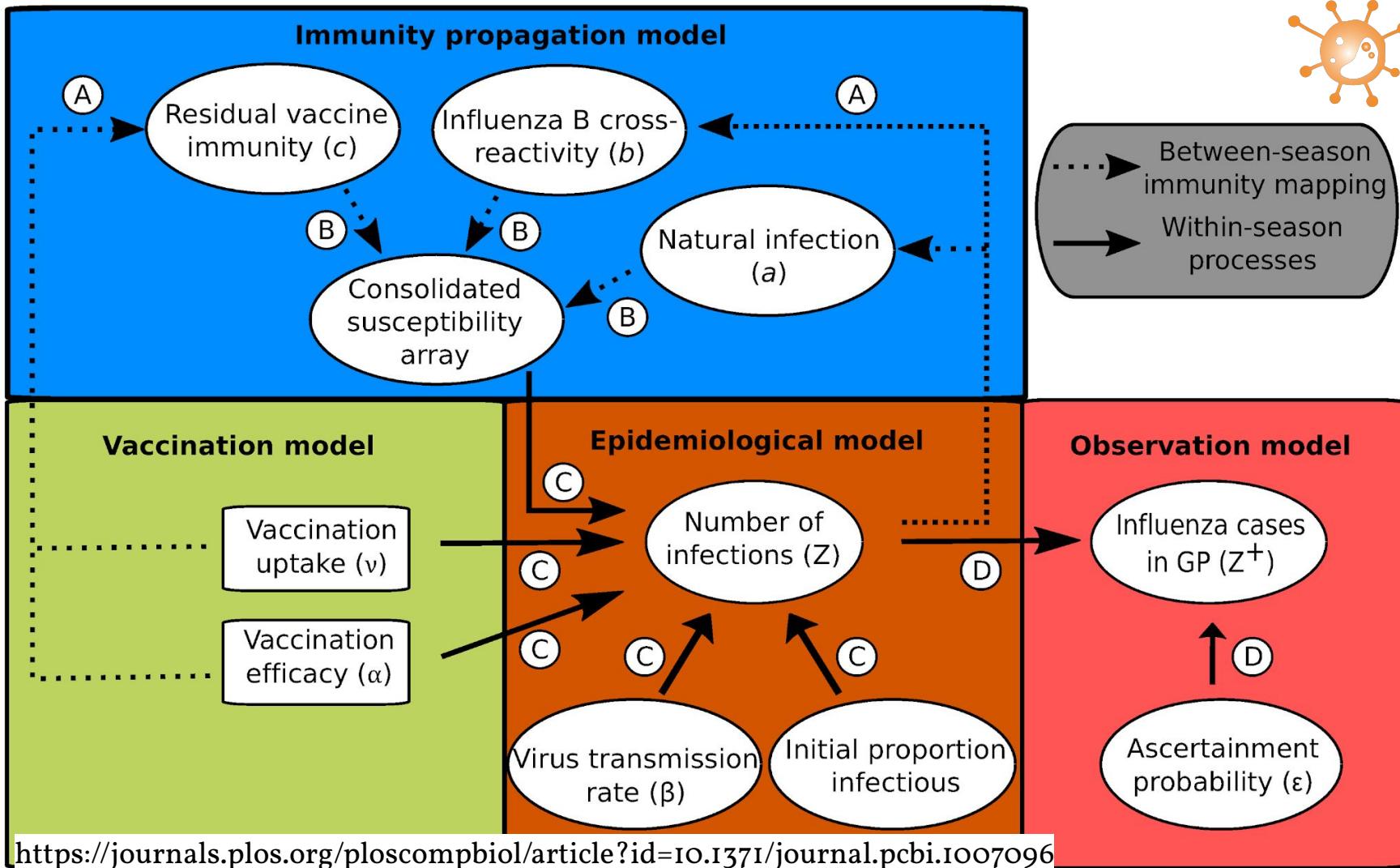


Sources  
CDC; NCHS  
© Statista 2019

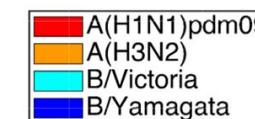
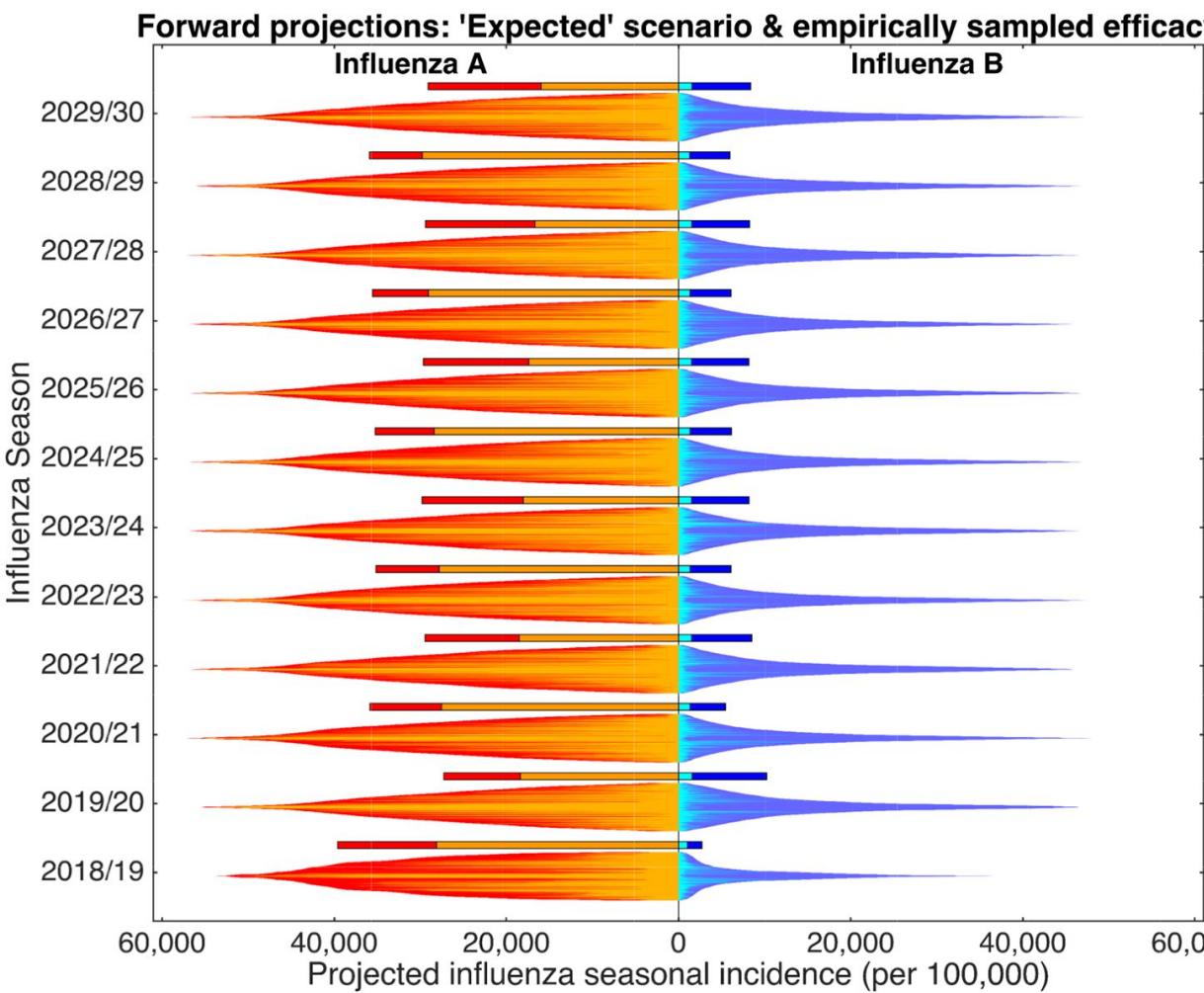


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# INFLUENZA

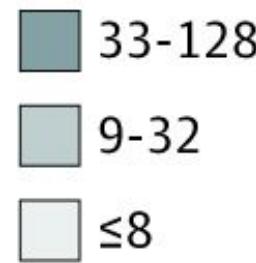
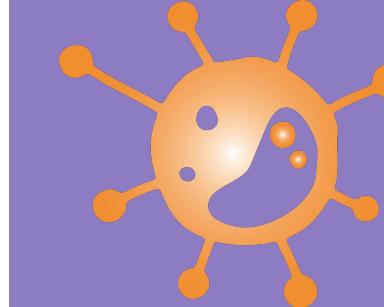


(a) <https://journals.plos.org/ploscompbiol/article?id=10.1371/journal.pcbi.1007096>

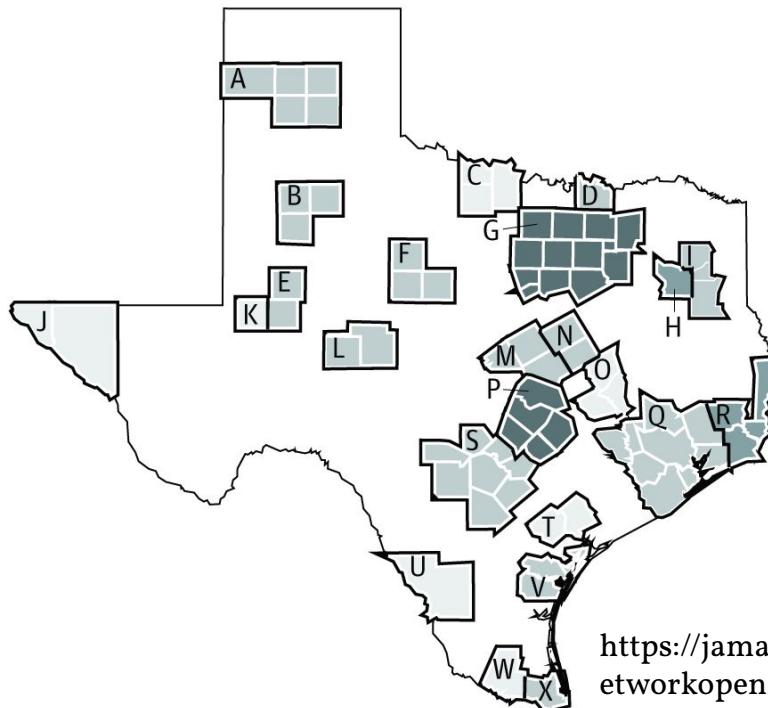


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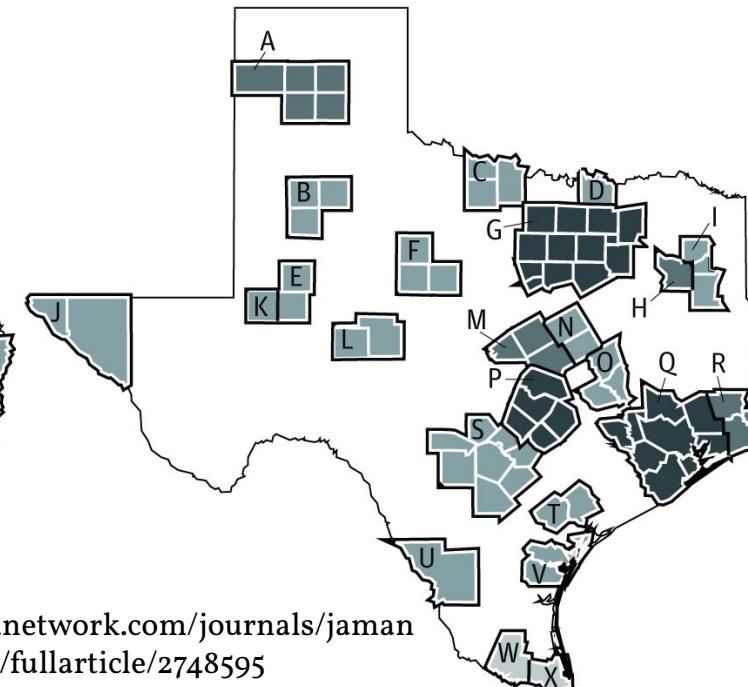
# M e a s e s



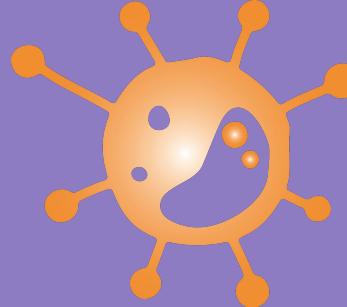
**A** 95th Percentile No. of cases at 2018 vaccination rates



**B** 95th Percentile No. of cases at 5% reduced vaccination rate



# Pakistan

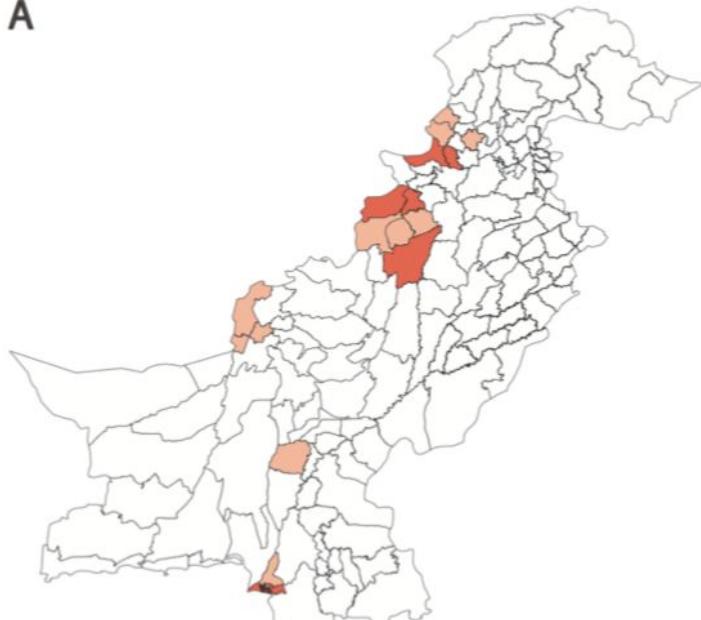


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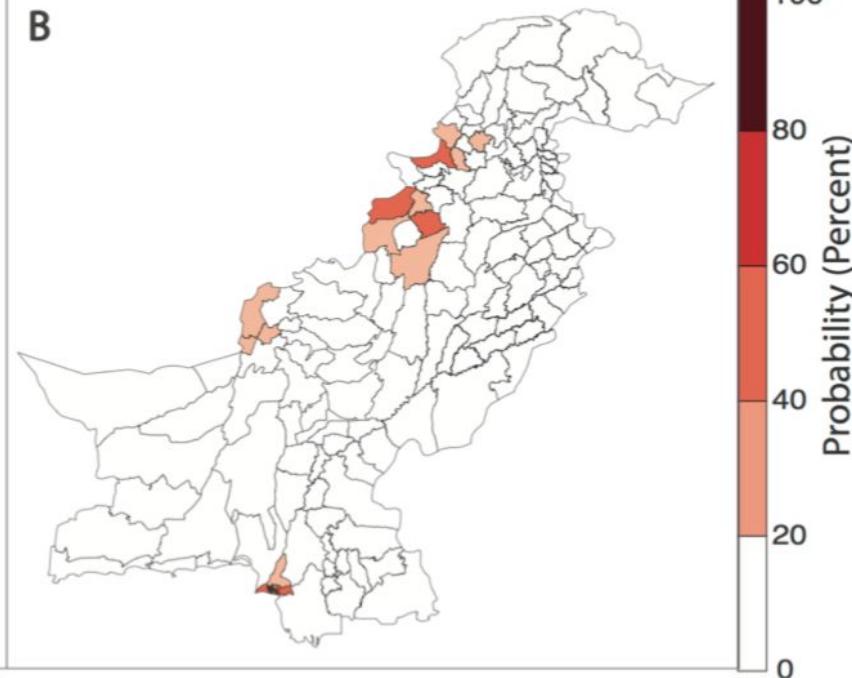
July to December 2016

January to June 2017

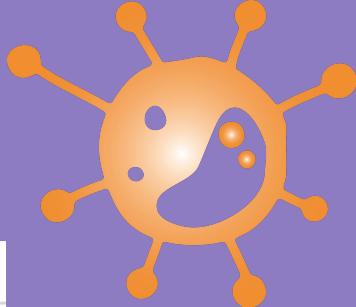
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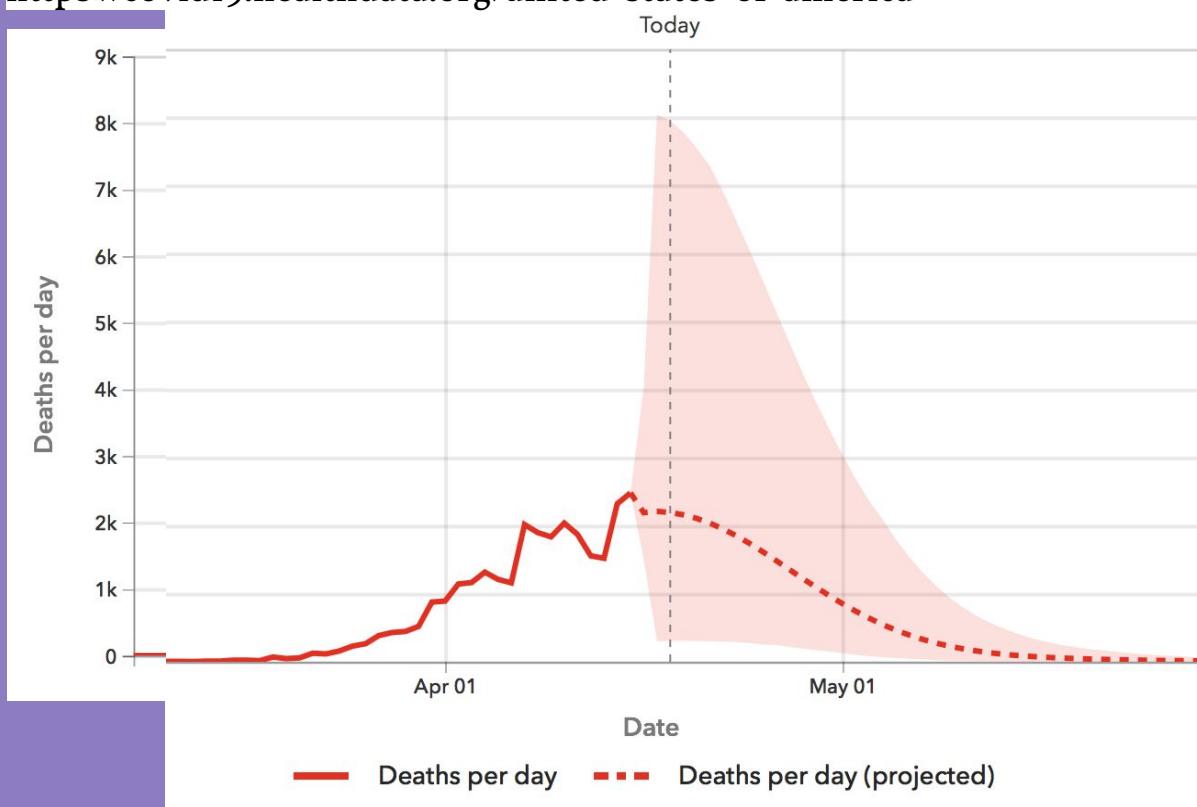
B



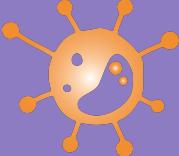
# COVID-19



<https://covid19.healthdata.org/united-states-of-america>

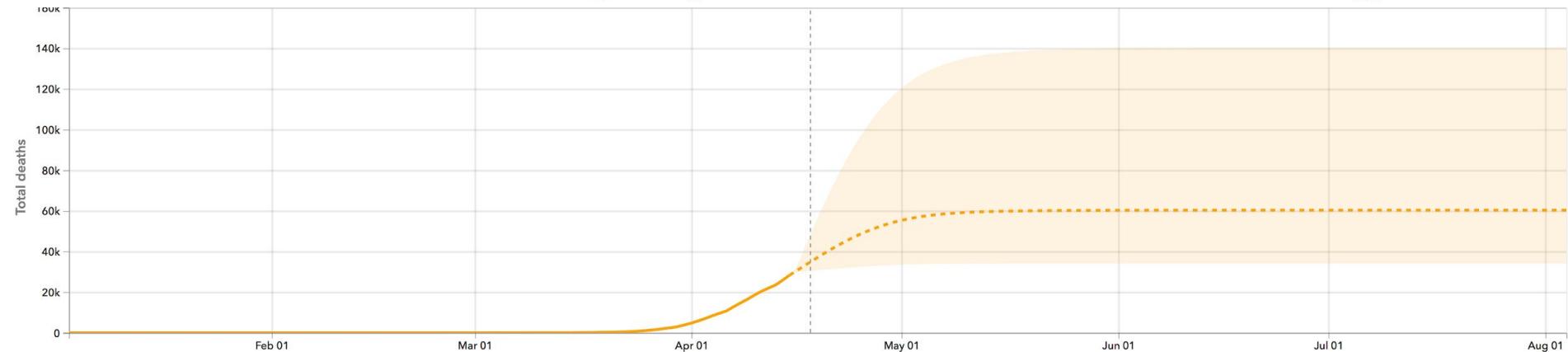


# COVID-19

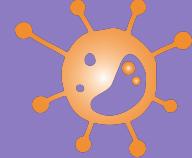


$$D(t; \alpha, \beta, p) = \frac{p}{2} (\Psi(\alpha(t - \beta))) = \frac{p}{2} \left( 1 + \frac{2}{\sqrt{\pi}} \int_0^{\alpha(t-\beta)} \exp(-\tau^2) d\tau \right)$$

where the function  $\Psi$  is the Gaussian error function (written explicitly above),  $p$  controls the maximum death rate at each location,  $t$  is the time since death rate exceeded 1e-15,  $\beta$  (beta) is a location-specific inflection point (time at which rate of increase of the death rate is maximum), and  $\alpha$  (alpha) is a location-specific growth parameter. Other sigmoidal functional forms (alternatives to  $\Psi$ ) were considered but did not fit the data as well. Data were fit to the log of the death rate in the available data, using an optimization framework described in the appendix.



# SIRS Mathematics



$$\frac{dS}{dt} = -\frac{\beta SI}{N}$$

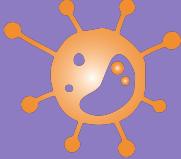
$$\frac{dI}{dt} = \frac{\beta SI}{N} - \gamma I$$

$$\frac{dR}{dt} = \gamma I$$

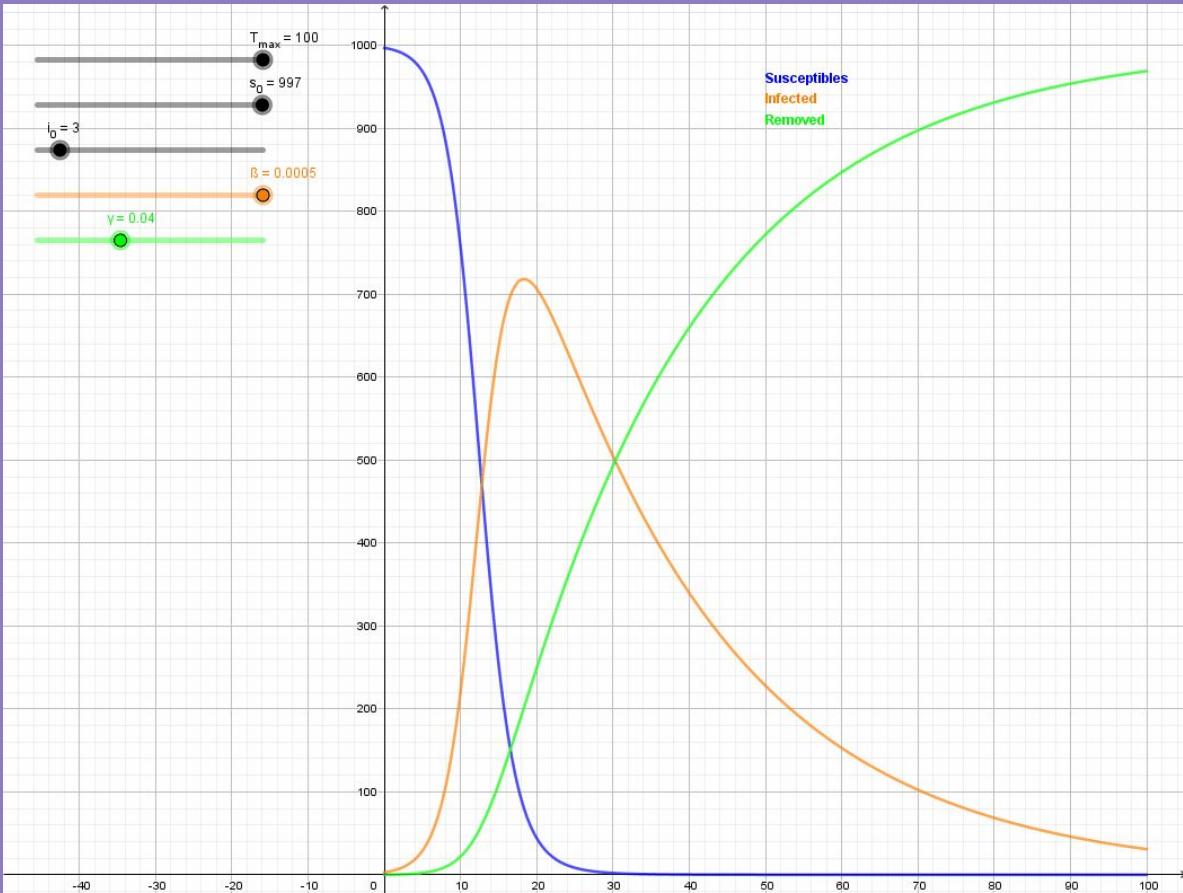
$\beta$  = contact rate

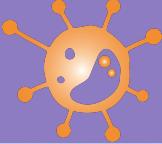
$\gamma$  = “recovery” rate



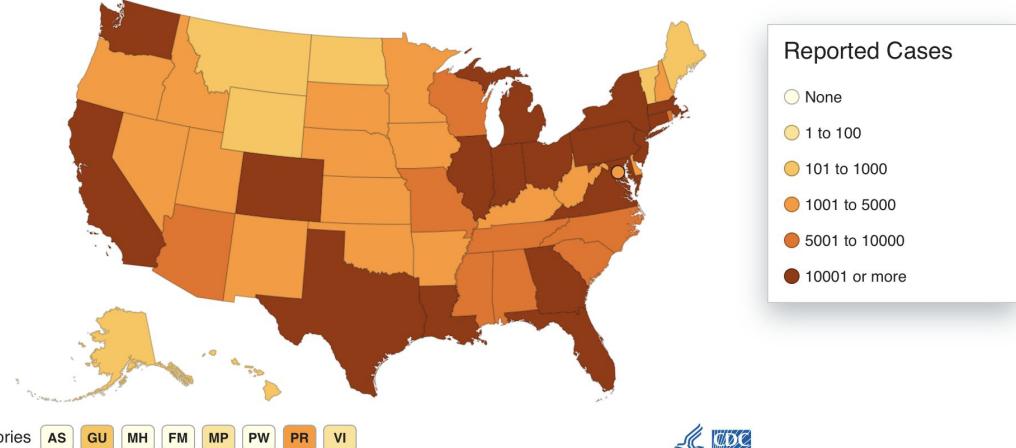
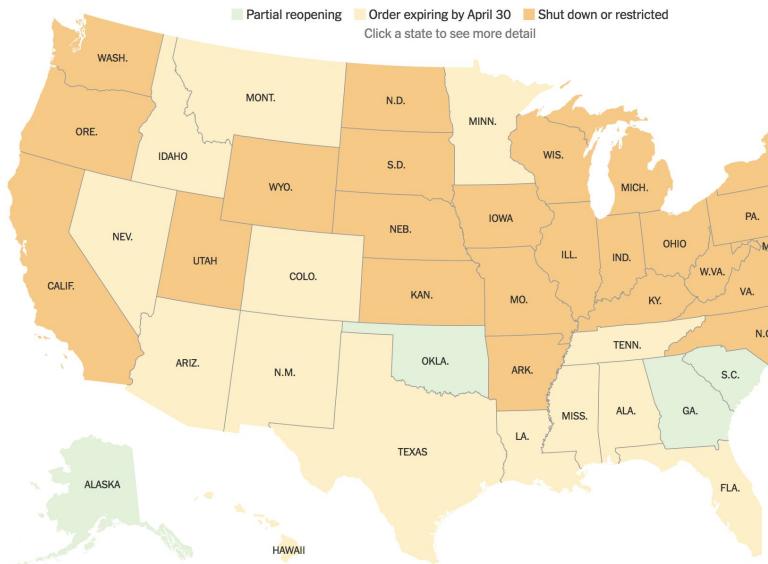


# SIR's Animation



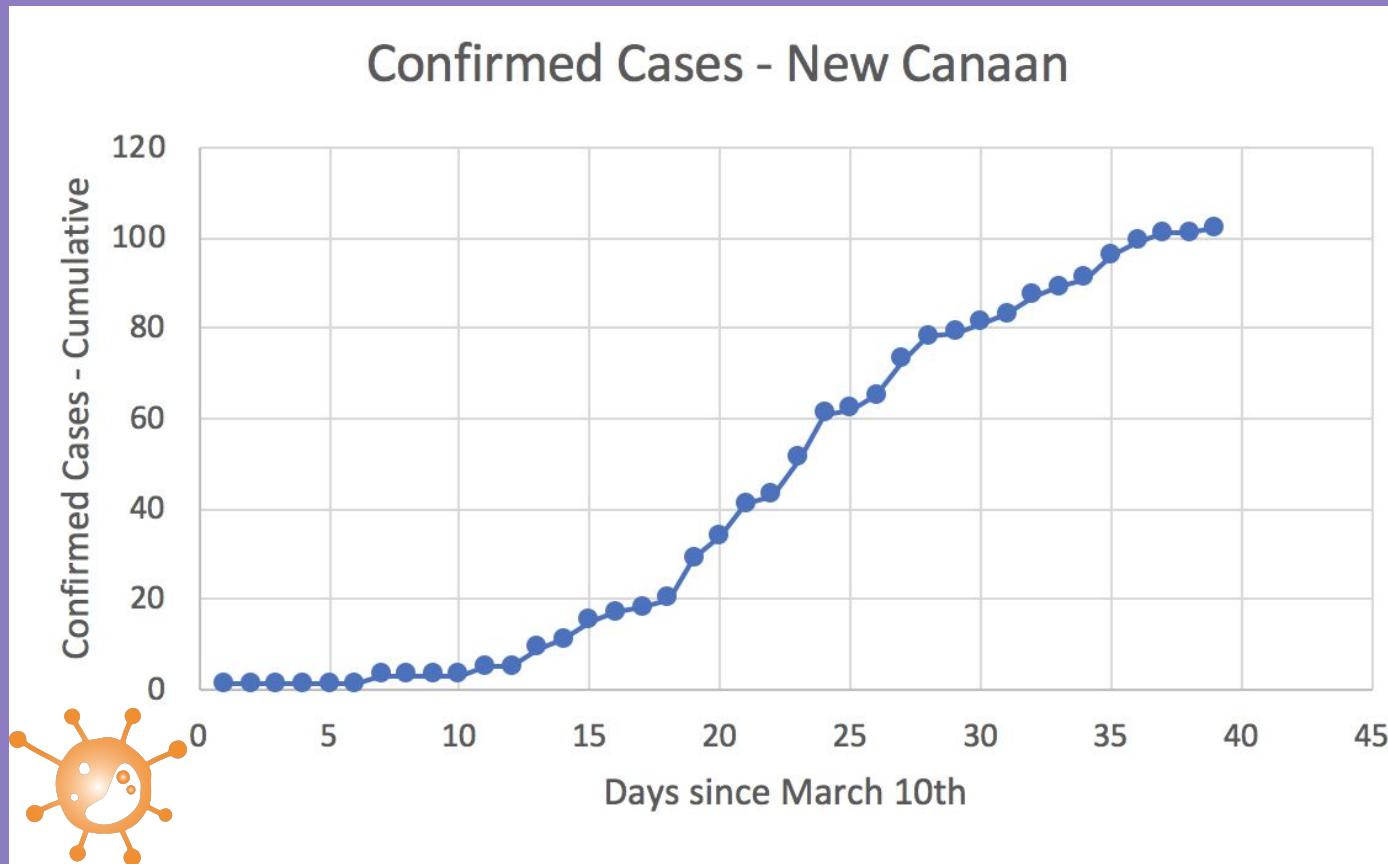


# Allocation of Resources



# New Canaan Coronavirus Modeling

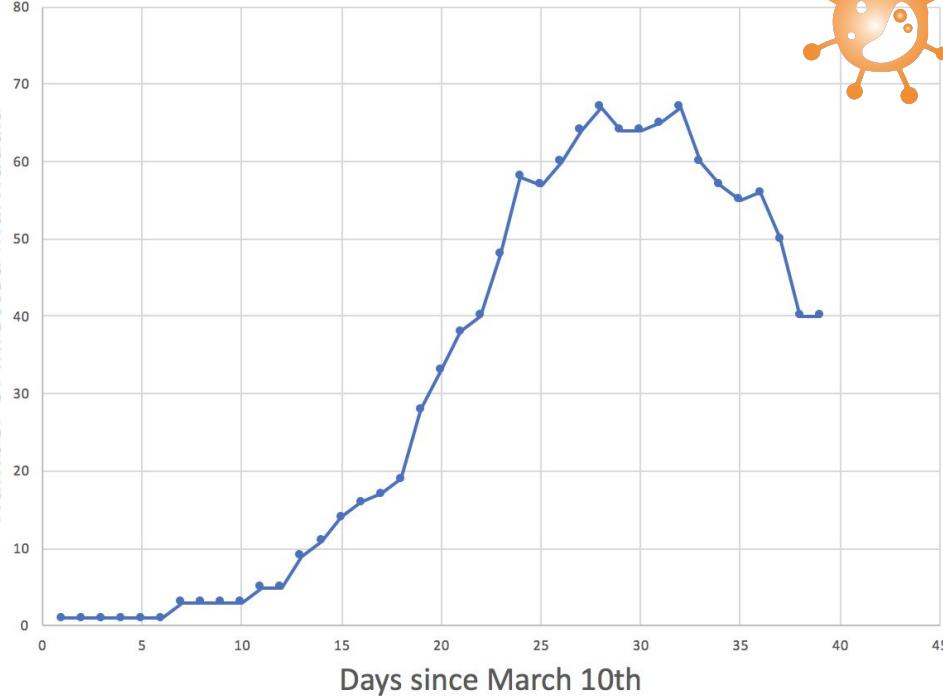
CT State  
Gov.  
Report:  
March 11th  
- April  
18th, 2020



# New Canaan Coronavirus Modeling

Interpreting the I-Curve (two-week cutoff)

Number of Infected Individuals



Apr. 11th

32

67

Fitting the SIR model of disease to data in Python

```
#!/usr/bin/env python3
# -*- coding: utf-8 -*-
"""
Description: Python program to fit SIR Curve to available NC Coronavirus Data
"""

import pandas as pd
import matplotlib.pyplot as plt
import numpy as np
from scipy.integrate import solve_ivp
from scipy.optimize import minimize

originalData = pd.read_csv("coronaVirusData.csv")
data = originalData[" # of Infected Individuals "]
print(len(data))

def sumsq(p):
    beta, gamma = p
    def SIR(t,y):
        S = y[0]
        I = y[1]
        R = y[2]
        return([-beta*S*I, beta*S*I-gamma*I, gamma*I])
    sol = solve_ivp(SIR,[0,len(data)-1],[2000,1,0],t_eval=np.arange(0,len(data)+.2-1,.2))
    return(sum((sol.y[1][:5]-data)**2))

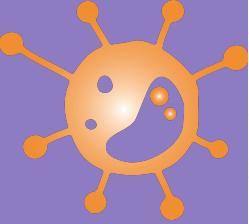
msol = minimize(sumsq,[0.001,1],method='Nelder-Mead')
print(msol.x)

beta,gamma = msol.x

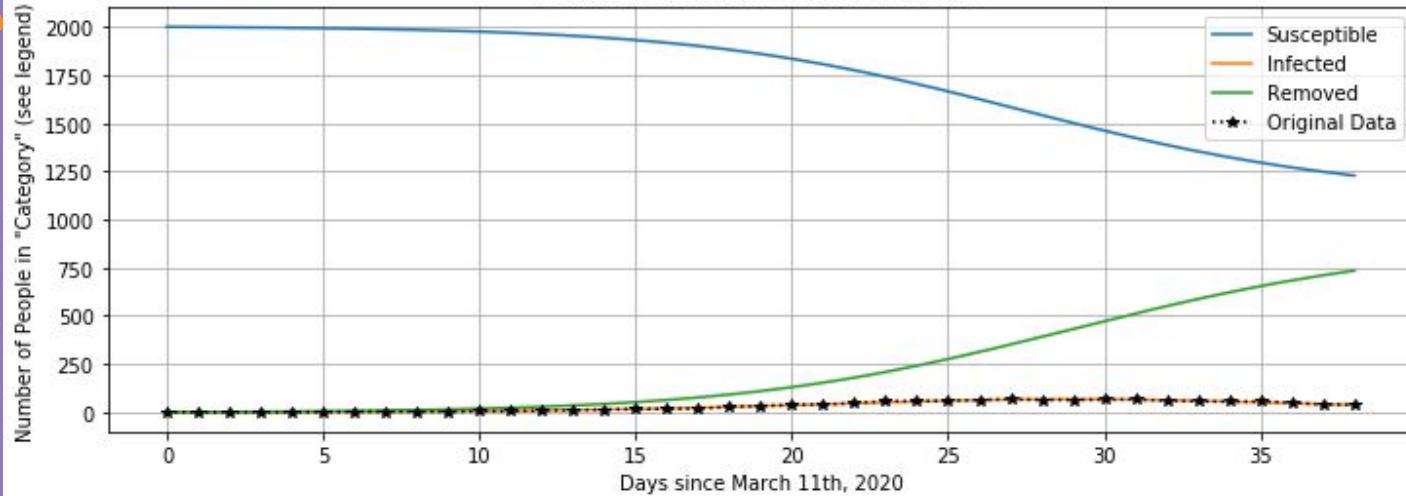
def SIR(t,y):
    S = y[0]
    I = y[1]
    R = y[2]
    return([-beta*S*I, beta*S*I-gamma*I, gamma*I])

sol = solve_ivp(SIR,[0,len(data)-1],[2000,1,0],t_eval=np.arange(0,len(data)+.2-1,.2))

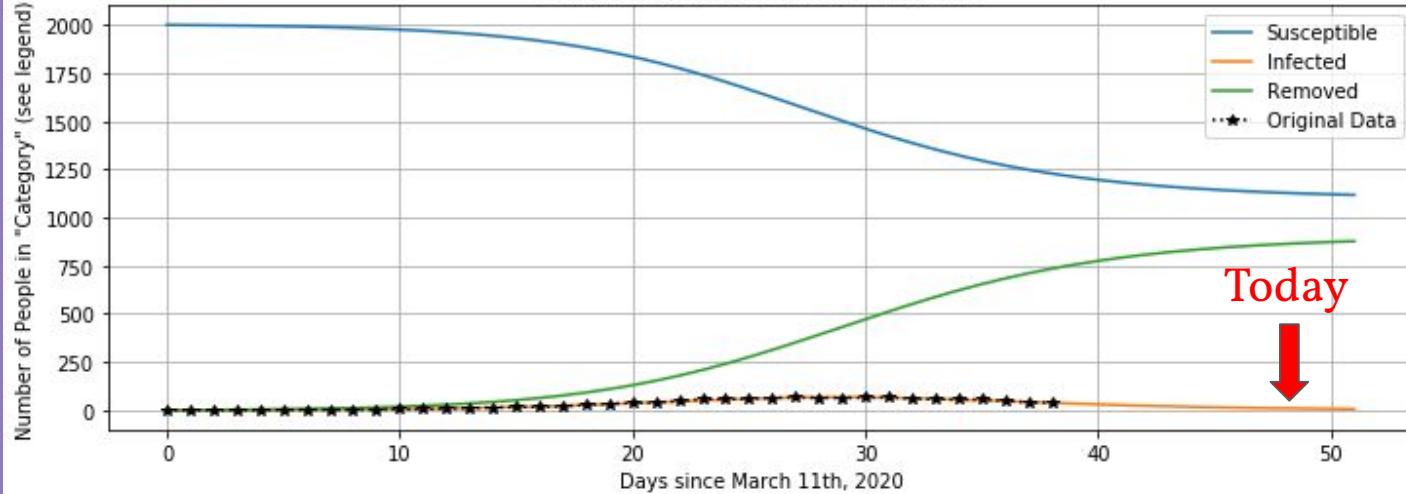
fig = plt.figure(figsize=(12,4))
plt.plot(sol.t,sol.y[0])
plt.plot(sol.t,sol.y[1])
plt.plot(sol.t,sol.y[2])
plt.plot(np.arange(0,len(data)),data,"k*:")
plt.grid("True")
plt.legend(["Susceptible","Infected","Removed","Original Data"])
plt.show()
```



### SIR Model for New Canaan COVID-19

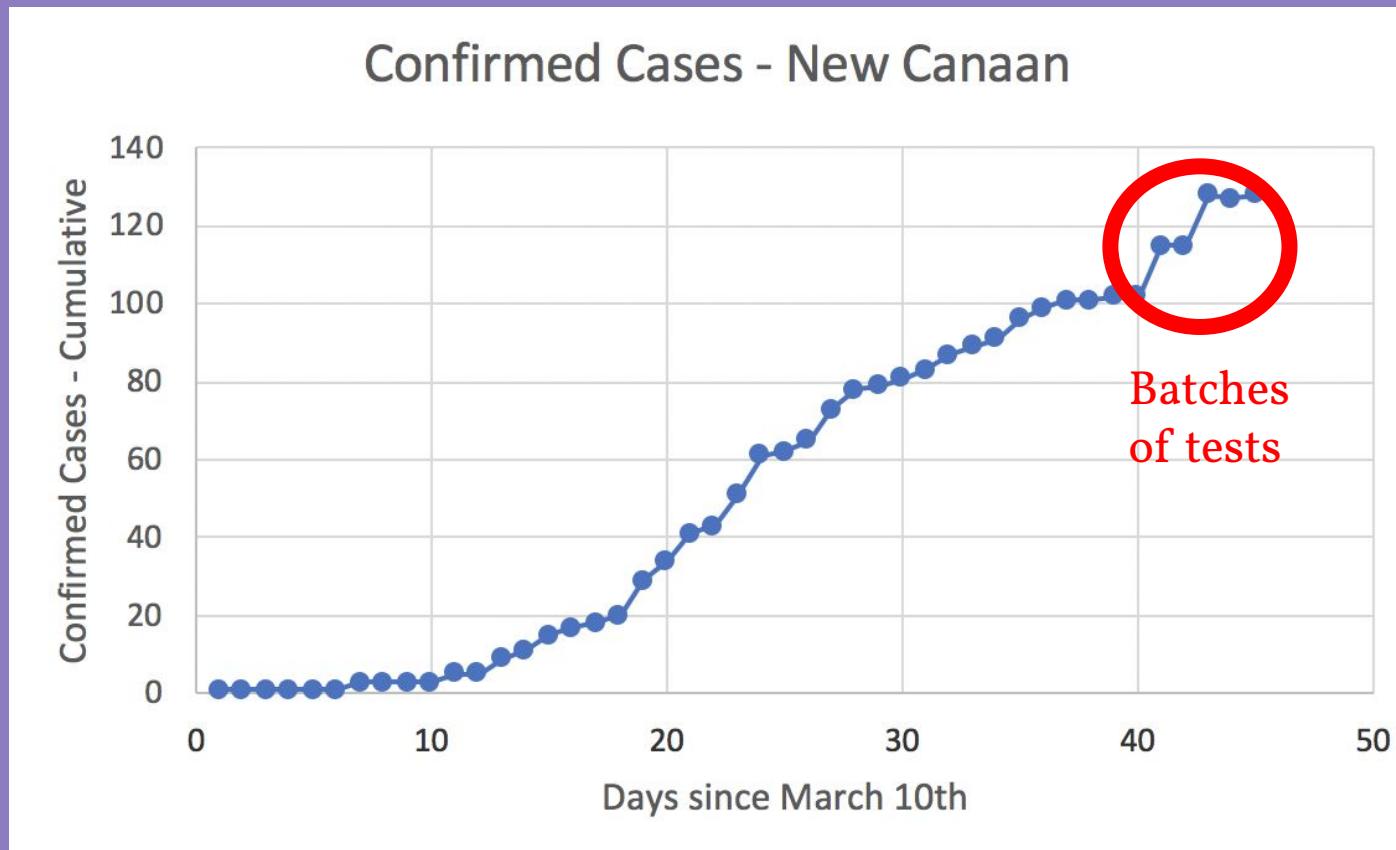
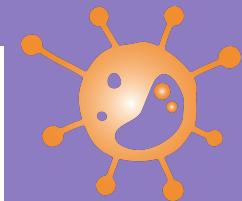


### SIR Model for New Canaan COVID-19



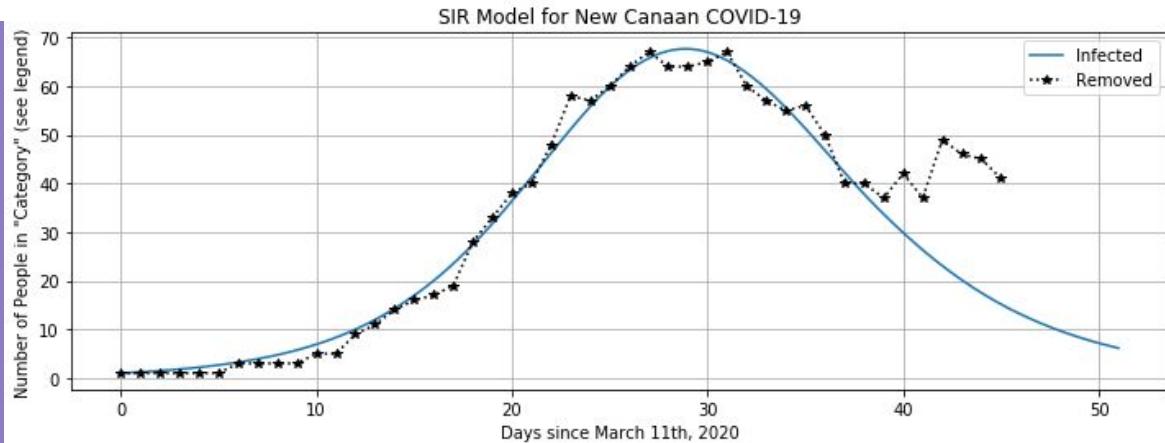
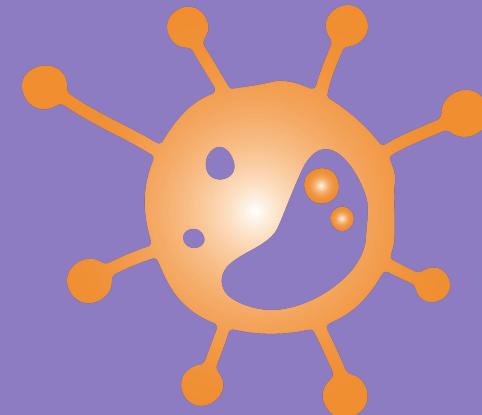
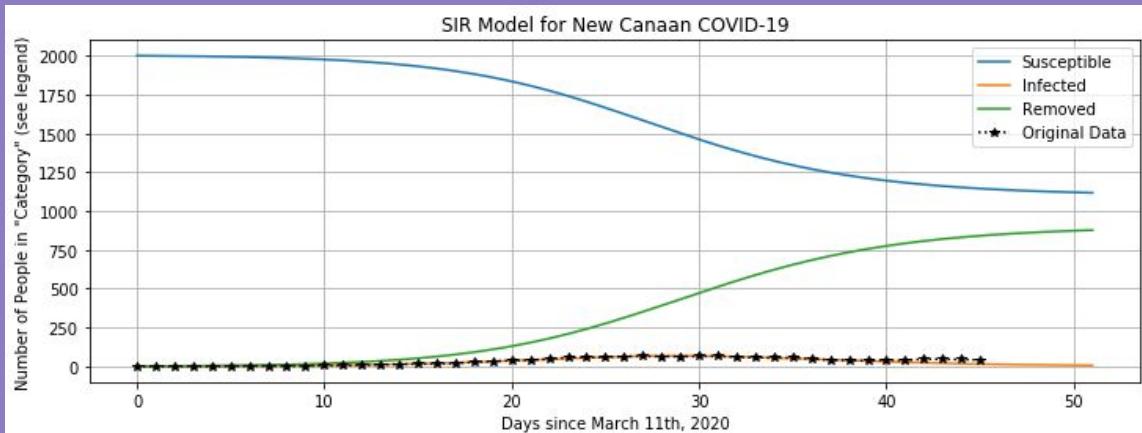
# New Canaan Coronavirus Modeling

Apr. 25th Update



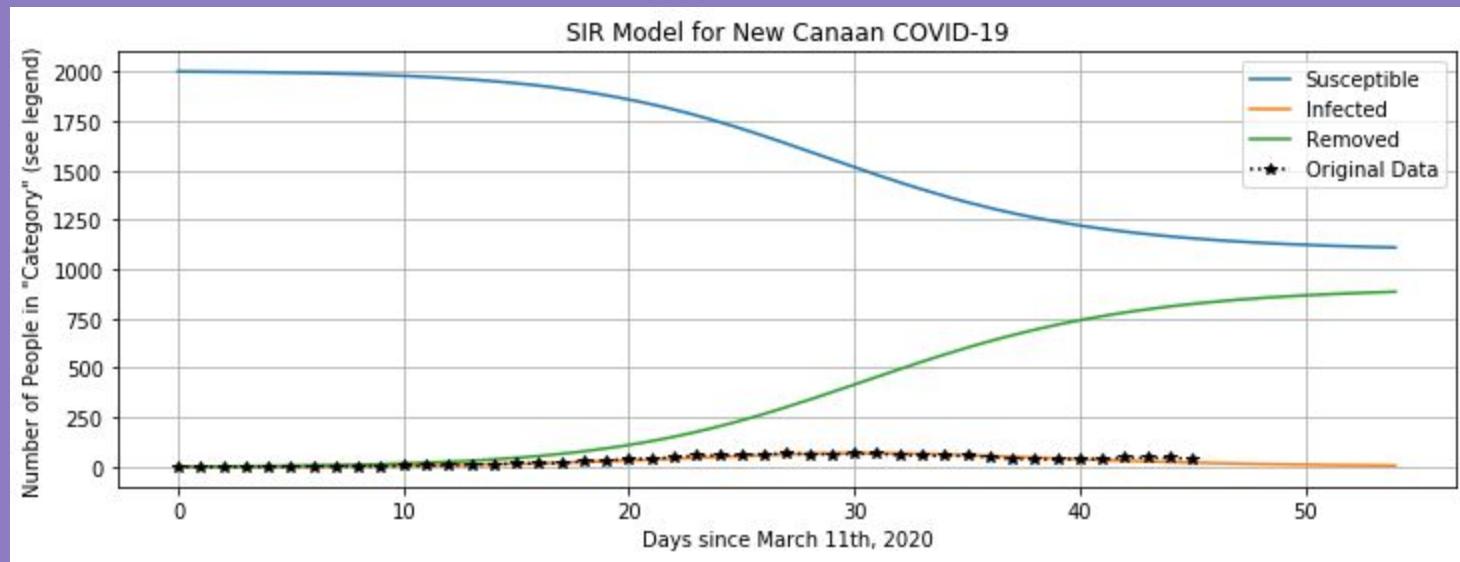
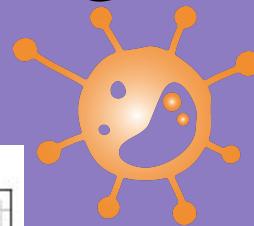
# New Canaan Coronavirus Modeling

Apr. 25th Update

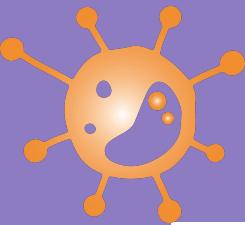


# New Canaan Coronavirus Modeling

Apr. 25th Update

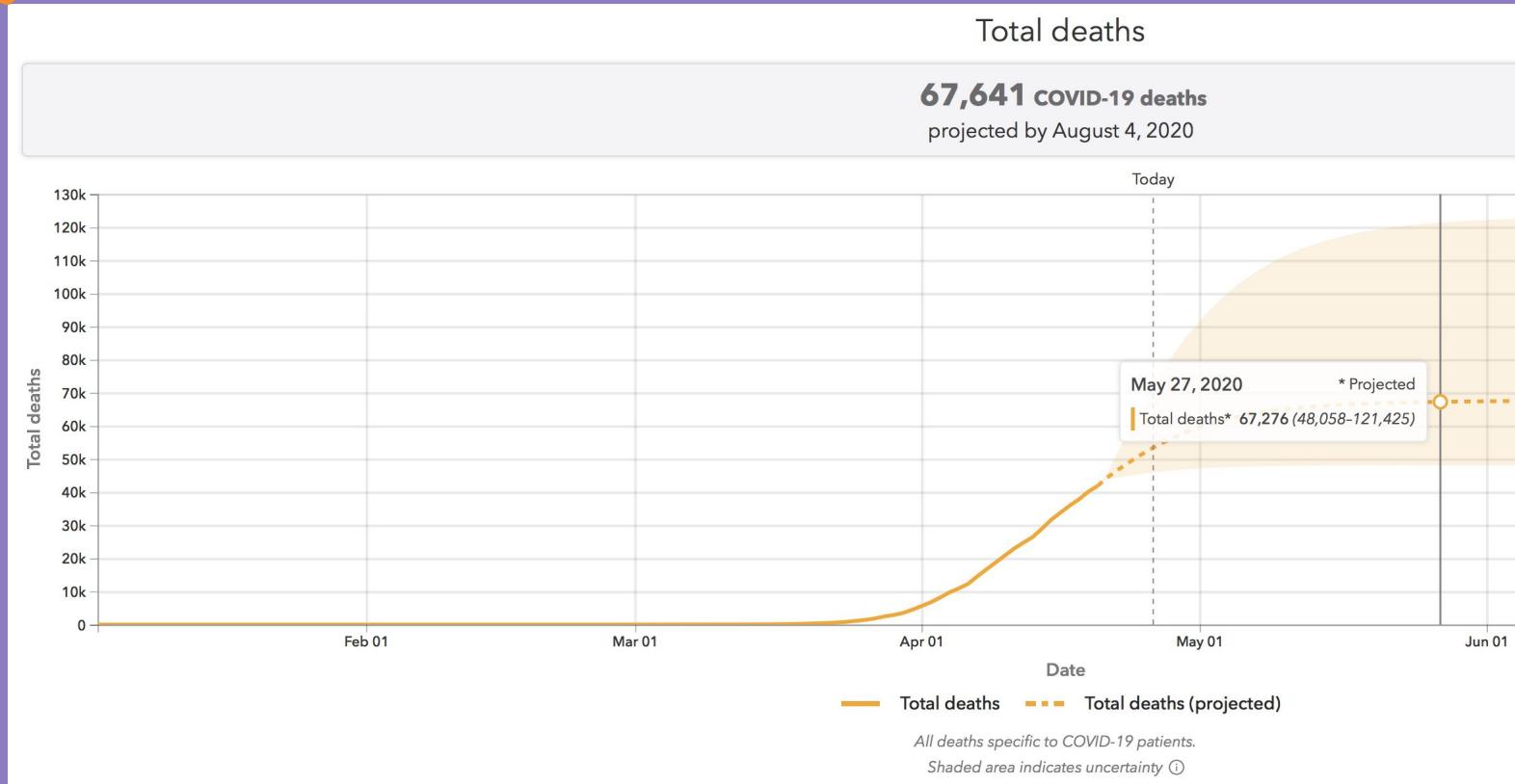


# Similar Projections as Before!



# Coronavirus Modeling

## Apr. 25th Update



# Epidemics Modeling - Data Science

towards  
data science

DATA SCIENCE

MACHINE LEARNING

PROGRAMMING

VISUALIZATION

AI

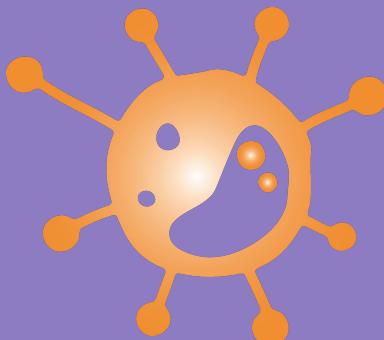
VIDEO

...

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For more info about the coronavirus, see [cdc.gov](https://www.cdc.gov).

## Modelling the coronavirus epidemic in a city with Python

Are cities prepared for epidemics?



towards  
data science

DATA SCIENCE

MACHINE LEARNING

PROGRAMMING

VISUALIZATION

AI

VIDEO

...

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For more info about the coronavirus, see [cdc.gov](https://www.cdc.gov).

## Infectious Disease Modelling: Beyond the Basic SIR Model

# Sources

