



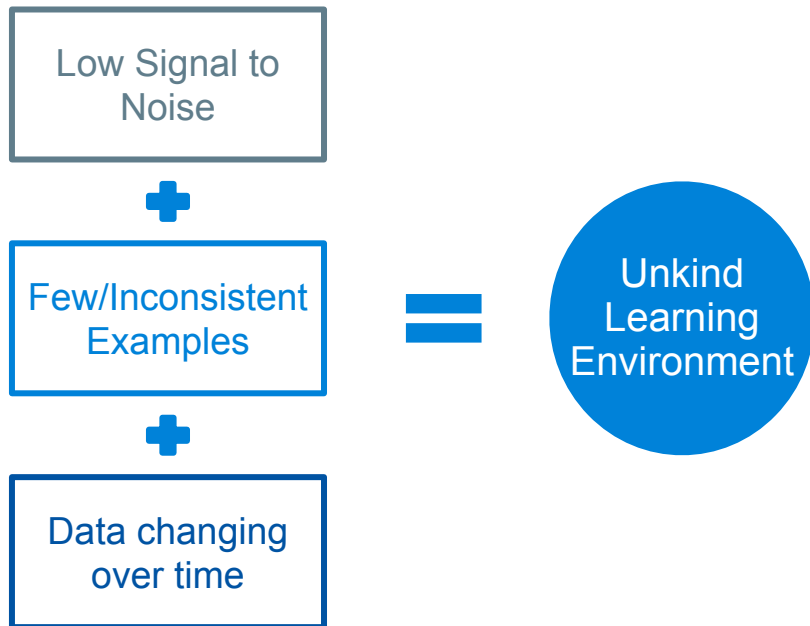
Ben Reeves  
Viewpoint Investment Partners  
YYC Data Society

# Tell your Data's Story; the Bayesian Way!

human intelligence + machine intelligence = ai nirvana

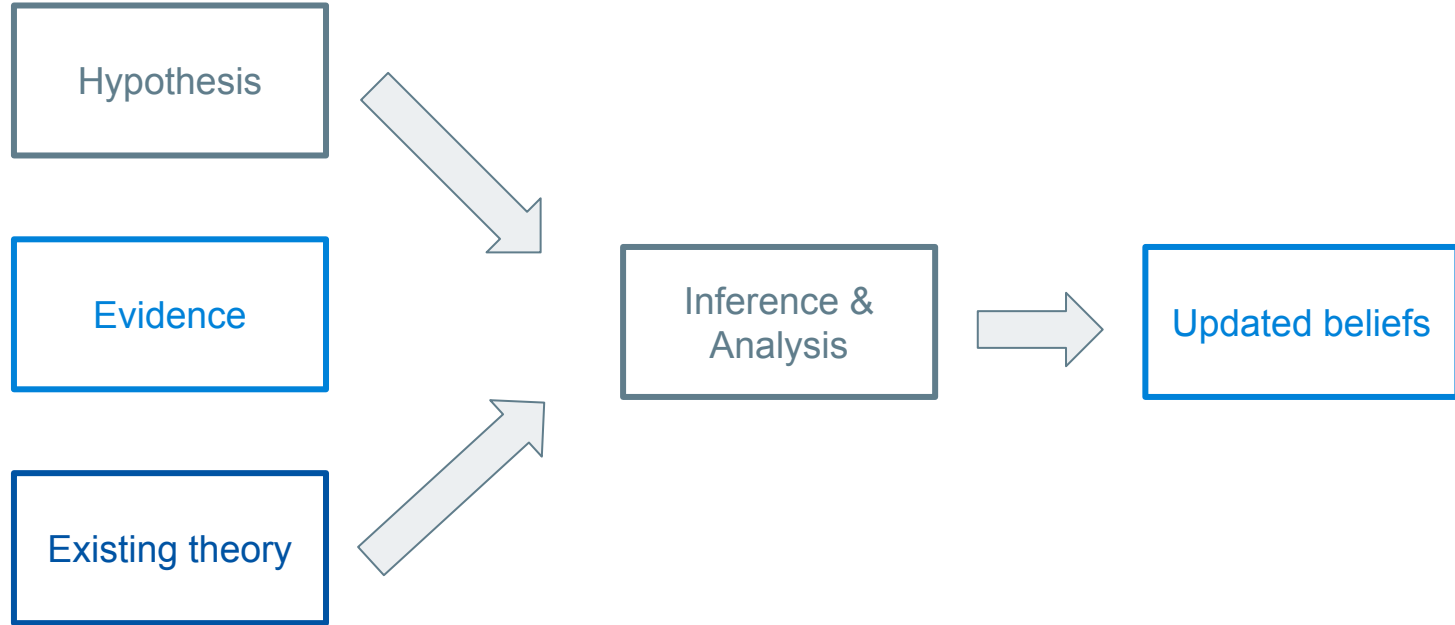


# What to do when your data wants to lie to you?



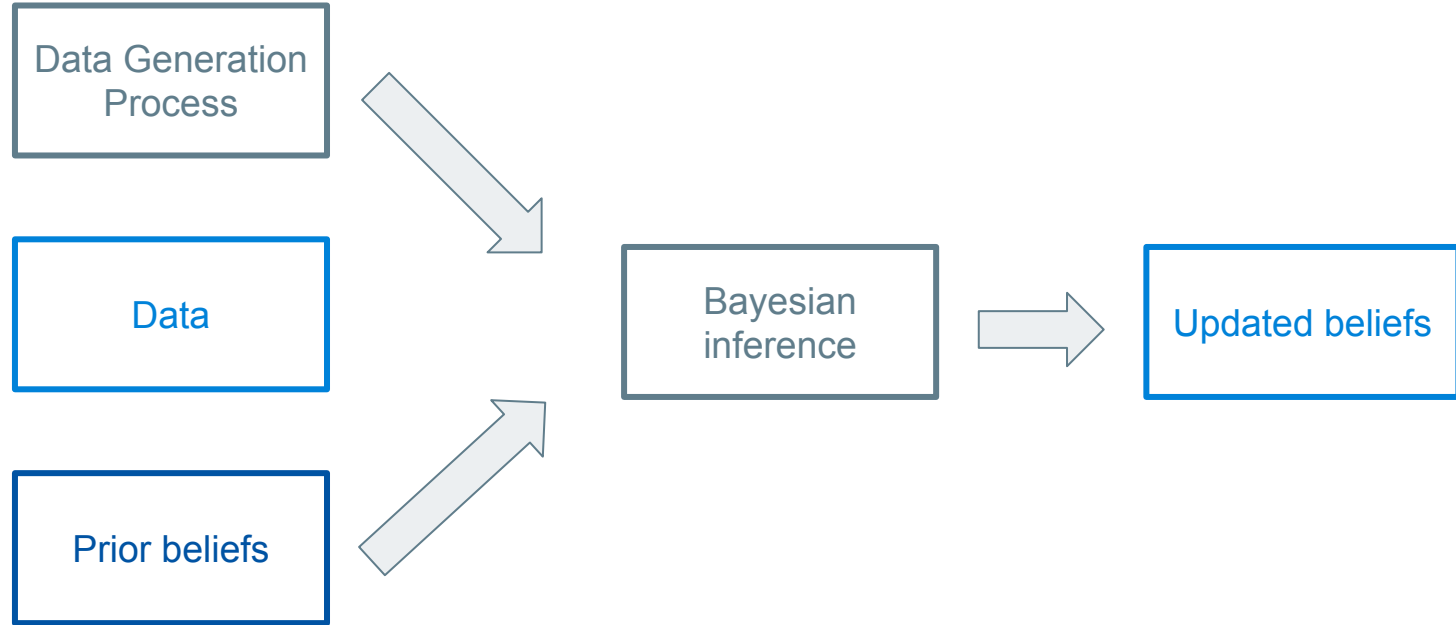


# The scientific method: one tool to fight the chaos





## Putting the science in data science



# A Motivating Example



## Breaking Down Bayes

$$\begin{array}{c} \nearrow \text{posterior} \\ P(\theta | X) = \frac{P(X | \theta) \cdot P(\theta)}{\int_{\theta} P(X | \theta) \cdot P(\theta) d\theta} \end{array}$$

$\downarrow$  data

$\nearrow$  sampling     $\nearrow$  prior

$\downarrow$  for every possible  $\theta$

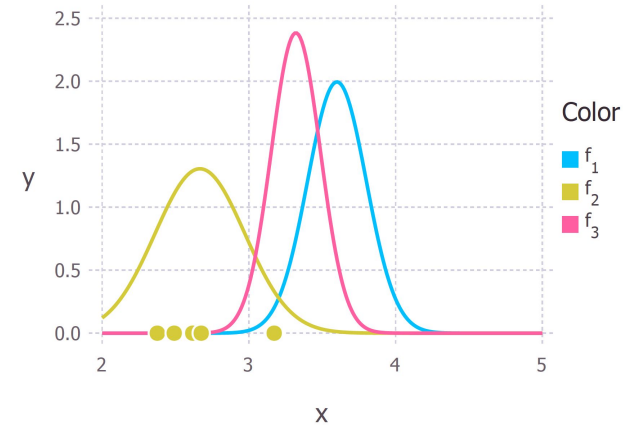
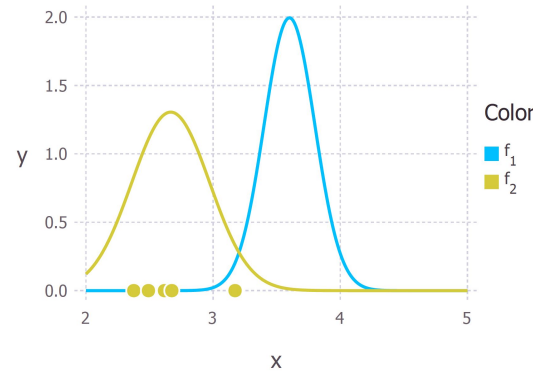
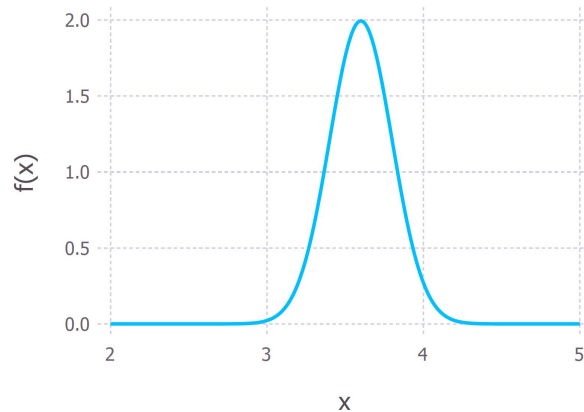
$\rightarrow$  normalizing constant

# Bayes: just a weighted average of hypothesis and evidence

Prior beliefs [Blue]  
I think 3%-4% of the population  
will get Covid vaccines per  
month

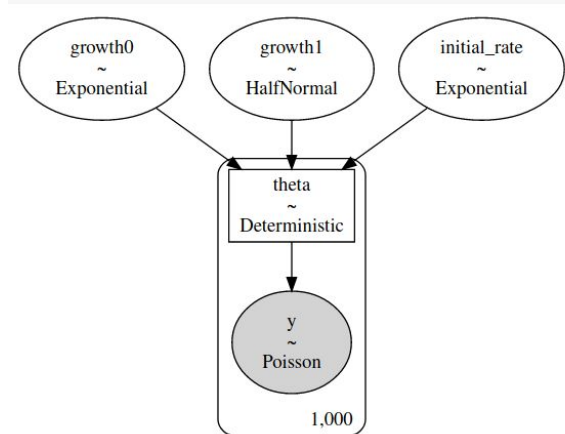
Data [Yellow]  
We get vaccinated, but not as  
much as expected

Posterior [Pink]  
I still think we'll get vaccinated  
faster, but my expectations are  
tempered



## Back to our CMO's question

- ⦿ You have intuition about what might have happened
- ⦿ We will turn that intuition into a story and test its veracity





# MCMC Demo

<https://colab.research.google.com/drive/1kIVWy9rBRCMIZvTzwGupkaqLpFD45rl8>

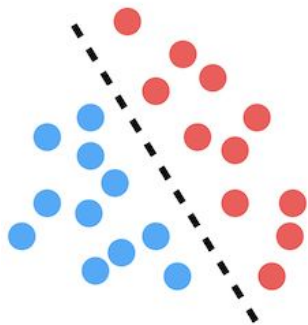




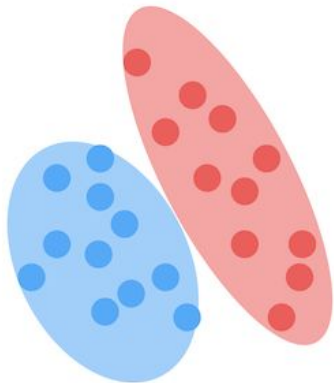
# A Tale of Two Models

Drawing boundaries vs modelling distributions

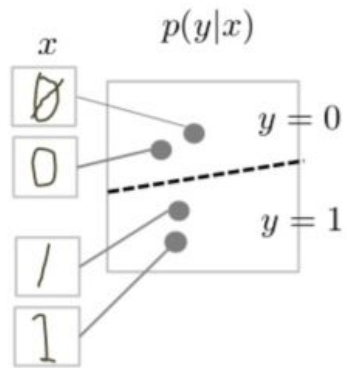
**Discriminative**



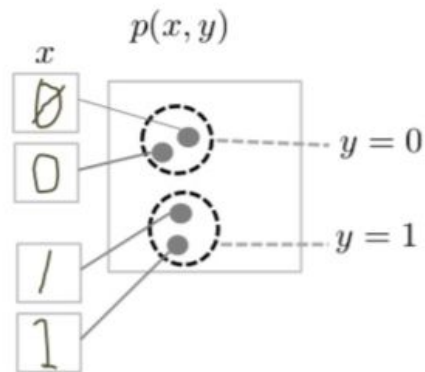
**Generative**



• Discriminative Model

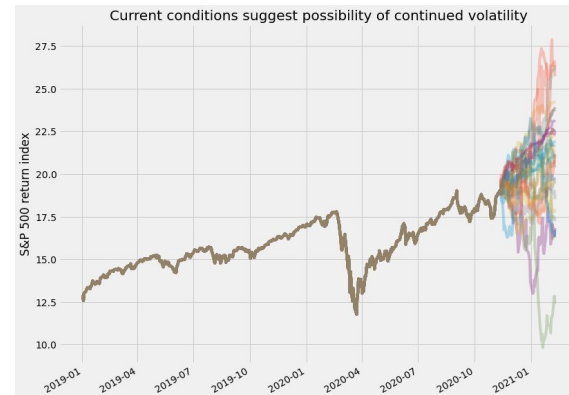
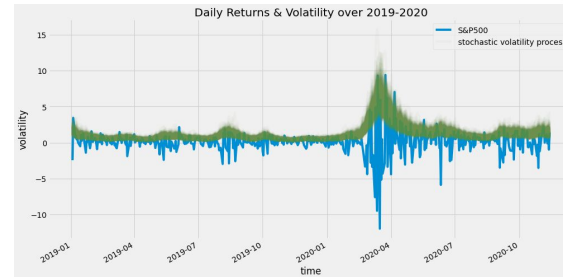


• Generative Model



# Understanding the past to simulate the future

- Fit a data generation process to S&P 500 returns
- Check reasonability of our model
- Simulate future possibilities given present conditions



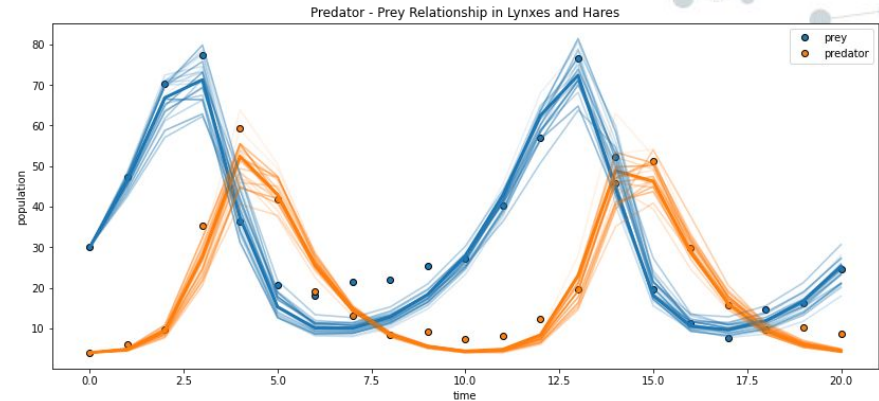
# S&P500 Demo

<https://colab.research.google.com/drive/1w0HPapmvPLNIngi1801BmdpbqFYQn8XL#scrollTo=ivmdm53UEs4Y>



# Testing scientific hypotheses with Bayesian statistics

- Predator-prey relationship expressed as ODE
- Wanted: estimate parameters from data
- Simulate possibilities and search for best parameters



$$\frac{d}{dt}u = (\alpha - \beta v)u = \alpha u - \beta uv$$

$$\frac{d}{dt}v = (-\gamma + \delta u)v = -\gamma v + \delta uv$$

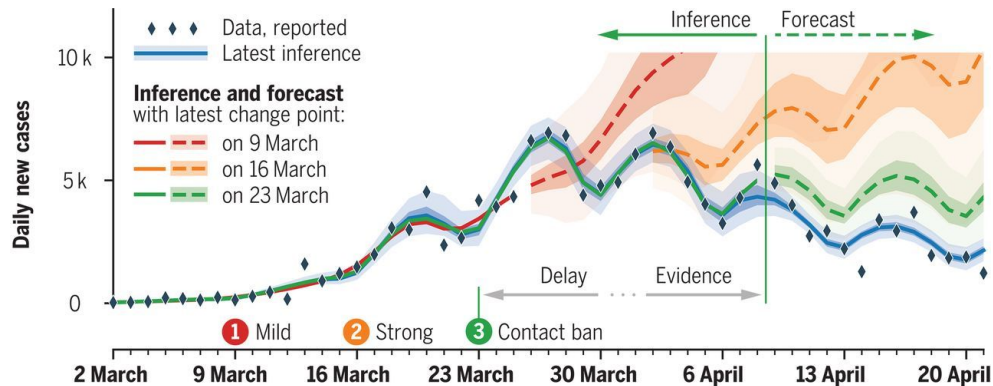
# ODE Demo!

<https://colab.research.google.com/drive/1CqIZDVHRC7YqfkW6EYHhGWELJ3og0GtI>



# Conclusion: All models are approximations

- Useful models answer questions:
  - What if I see X?
  - What if Y changes?
  - How likely is Z?
- Generative models help us understand how our data came to be
- Bayesian methods help our models understand how our data came to be



# Thanks!

Shameless Plugs:

- [YYC DataCon](#)
- [YYC Data Society](#)

