# An introduction to probabilistic programming with PyMC3

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7. februar 2020

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Introduction

Bayesian statistics

Markov Chains



# Road map

- Theory
  - ► The basics of Bayesianism
  - ► Markov chain Monte Carlo methods (MCMC)
- Practice
  - ► Probabilistic programming with PyMC3

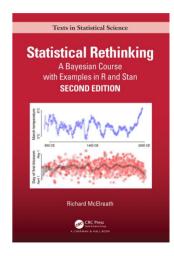


# What is Bayesian data analysis?

"A Bayesian is one who, vaguely expecting a horse, and catching a glimpse of a donkey, strongly believes he has seen a mule."

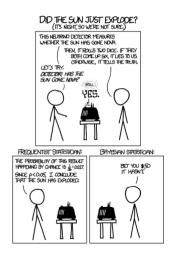
## What is Bayesian data analysis?

- Richard McElreath: "Bayesian inference is just counting."
- Count all the ways observed data could have arisen according to assumptions
- Assumptions that can arise in more ways are more consistent with the data, and therefore more plausible



# The Frequentist vs. Bayesian debacle

- Frequentist statistics
  - Probability defined as the limiting frequency at which events occur
  - Uncertainty arises from sampling variation
- Bayesian statistics
  - ► Frequency and probability are different things
  - Uncertainty arises from our ignorance of the true state of the world





# A slide with a theorem and a proof.

## Theorem (Integral)

$$\int_{a}^{b} f(x) dx = F(b) - F(a)$$

#### Bevis.

Here's the proof.





## A slide with blocks

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# A slide using pause

• Represent Abelian groups on the computer

# A slide using pause

- Represent Abelian groups on the computer
- Compute on Abelian groups



# A slide using pause

- Represent Abelian groups on the computer
- Compute on Abelian groups
- Solve equations, factor group homomorphisms