### MCMC Coffee More Coffee More Confidence



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Evidence Hypothesis



hypothesis "H" given the evidence "E"

Prior probability that the evidence is true







Pick bowl #1 or bowl #2...

...close your eyes...

### pick a random cookie from that bowl



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Evidence: you picked a plain cookie Hypothesis: you picked the cookie from bowl #1







Evidence: you picked a plain cookie Hypothesis: you picked the cookie from bowl #1





![](_page_7_Picture_4.jpeg)

### Statistics are useful (and critical in science)!

### Large datasets

![](_page_8_Picture_2.jpeg)

### Non-ideal instrumentation

![](_page_8_Picture_4.jpeg)

### Need for more precise data

![](_page_8_Figure_6.jpeg)

## Need to get the most out of our data

![](_page_8_Figure_8.jpeg)

![](_page_8_Picture_9.jpeg)

![](_page_8_Picture_12.jpeg)

### Statistics are useful (and critical in science)!

### An example: the DAnCe project

KPNO/Mosaic1 Subaru/SuprimeCam CFHT/CFHT12K UKIRT/WFCAM CTIO/MOSAIC2 CFHT/MegaCam INT/WFC CFHT/UH8K KPNO/NEWFIRM

![](_page_9_Figure_3.jpeg)

### 3.35x10<sup>6</sup> sources studied

![](_page_9_Picture_5.jpeg)

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![](_page_9_Picture_8.jpeg)

### Statistics are useful (and critical in science)!

### An example: the DAnCe project

Foreground sources

![](_page_10_Picture_3.jpeg)

Reddened sources

![](_page_10_Figure_5.jpeg)

![](_page_10_Figure_6.jpeg)

![](_page_10_Picture_7.jpeg)

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![](_page_10_Picture_10.jpeg)

### Statistics is just a tool for **extracting knwoledge from our data**

# **Interpreting** the conclusions and validity of the results **needs human interaction**

![](_page_11_Picture_3.jpeg)

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![](_page_11_Picture_6.jpeg)

![](_page_12_Picture_0.jpeg)

#### US spending on science, space, and technology correlates with

#### Suicides by hanging, strangulation and suffocation

![](_page_12_Figure_3.jpeg)

tylervigen.com

![](_page_12_Picture_5.jpeg)

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### For example...

#### Number of people who drowned by falling into a pool correlates with Films Nicolas Cage appeared in

![](_page_13_Figure_2.jpeg)

![](_page_13_Picture_3.jpeg)

![](_page_13_Picture_4.jpeg)

### For example...

![](_page_14_Figure_1.jpeg)

![](_page_14_Picture_2.jpeg)

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![](_page_14_Picture_5.jpeg)

(At least) the **basic theory** of statistics

$$P(H|E) = \frac{P(E|H) \times P(H)}{P(E)}$$

![](_page_15_Picture_3.jpeg)

e.g

![](_page_15_Picture_4.jpeg)

![](_page_15_Picture_6.jpeg)

(At least) the **basic theory** of statistics

$$P(H|E) = \frac{P(E|H) \times P(H)}{P(E)}$$

The statistic tools to apply to our data

![](_page_16_Figure_4.jpeg)

![](_page_16_Picture_5.jpeg)

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(At least) the **basic theory** of statistics The **statistic tools** to apply to our data How to **decide** which tool/s should be applied Model minesionality Model (Mines) (Model Mines) (Mines) (

![](_page_17_Picture_2.jpeg)

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Clustering

![](_page_17_Picture_5.jpeg)

(At least) the **basic theory** of statistics

The statistic tools to apply to our data

How to **decide** which tool/s should be applied

How to **compare** the results obtained from the different tools

![](_page_18_Figure_5.jpeg)

![](_page_18_Figure_6.jpeg)

![](_page_18_Picture_7.jpeg)

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(At least) the **basic theory** of statistics

The statistic tools to apply to our data

How to **decide** which tool/s should be applied

How to **compare** the results obtained from the different tools

How to **interpret** the results from our statistical analysis

![](_page_19_Figure_6.jpeg)

![](_page_19_Picture_7.jpeg)

![](_page_19_Picture_8.jpeg)

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### Philosophy of the MCMC Coffee

Ideal paper outline (advice by E. Feigelson)

- 1. Introduction
- 2. Observations and data reduction
- 3. Non-parametric exploration of my data
- 4. Maximum likelihood analysis
- Bayesian analysis
  (aka, include priors and see what happens)
- 6. Model comparison
- 7. Scientific discussion

![](_page_20_Picture_9.jpeg)

![](_page_20_Picture_12.jpeg)

## Wrong use of statistical techniques (and overuse of unefficient but popular tools)

- K-S test —> Anderson-Darling test
- Overuse of histograms for inference (e.g., fit a gaussian to a histogram to get the median...).
- Overuse of linear and power-law regressions —> use local regressions!
- Underuse of poisson regression
- Insufficient examination of regression results: R<sup>2</sup>, analysis of the residuals, autocorrelation, outliers via Cook distance, etc.

![](_page_21_Picture_6.jpeg)

- Overuse of Bayesian inference with uninformative priors (that's MLE!) —> Just use Bayesian inference when you have informative priors.
- Underuse of machine learning methods.

![](_page_21_Picture_9.jpeg)

![](_page_21_Picture_12.jpeg)

### Format of the sessions

- i. Quick overview of the scientific context
- ii. Statistical challenge: question you want to answer
- iii. Technique/s used and reasons for not using other.
- iv. Present the **code** and final solution that you found

![](_page_22_Picture_5.jpeg)

![](_page_22_Picture_6.jpeg)

![](_page_22_Picture_8.jpeg)

### **MCMC Coffee website**

### http://www.sc.eso.org/~jlillobo/mcmc\_coffee/index.html

![](_page_23_Figure_2.jpeg)

![](_page_23_Picture_3.jpeg)

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![](_page_23_Picture_6.jpeg)

## Thank you!