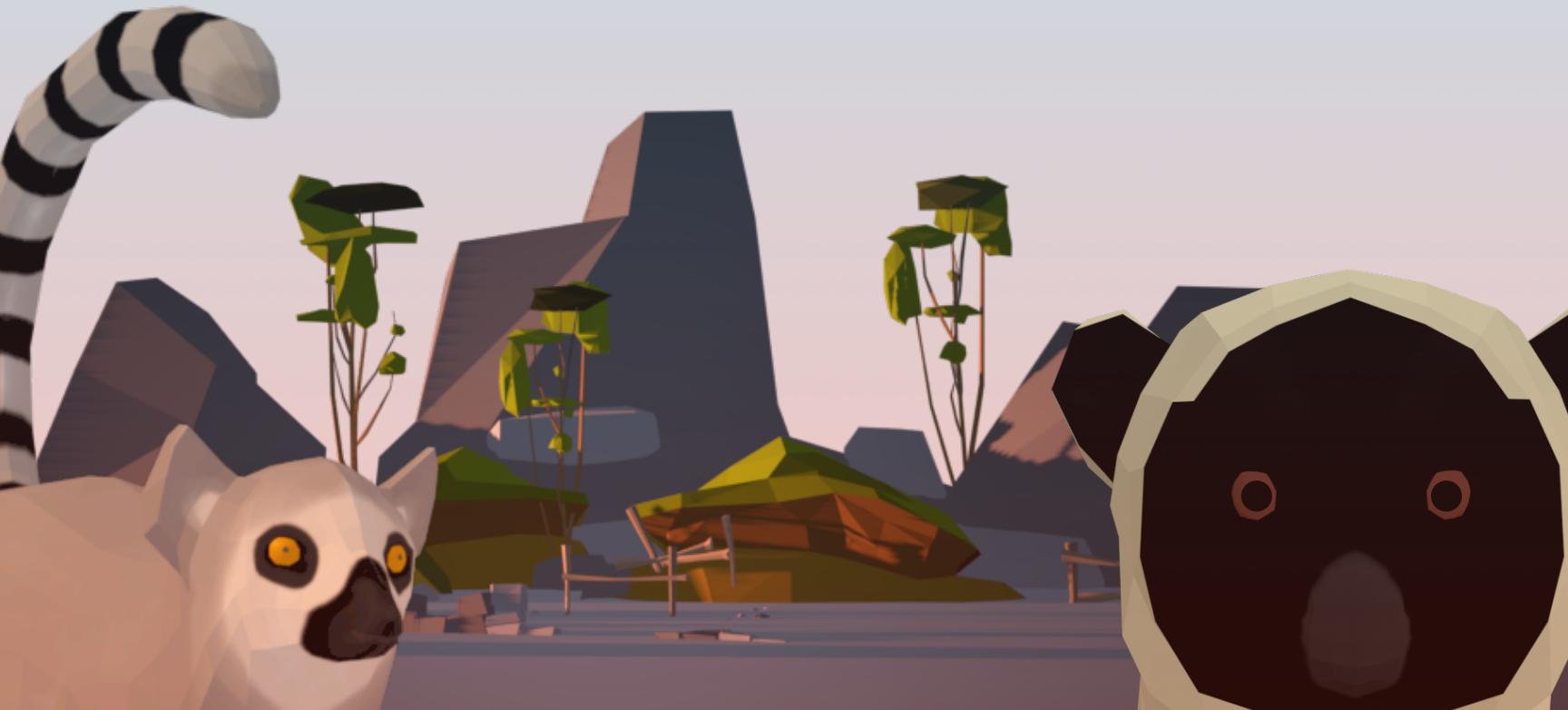


# Probability for Lemurs



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## **Special Request from the Author:**

### **If You Came Across This Book for Free and Found It Useful Please Buy It!**

I get it - on the Internet it's always easier to just take things for free and not think twice about it, that's just how it goes. Times are often tough for many of us, particularly for those of us starting out in our careers who perhaps don't have as much disposable income. I totally understand and that's fine.

But here's the thing - I spent many hours writing this book, and I don't have any nefarious designs toward creating some income scheme through trying to sell my readers on some bag of goods. This is literally just math education. I want to make it just a little bit easier for people around the world to learn about probability (and other math concepts in the future).

So, if you want to pitch in I would like to humbly request that you please buy this book. This will help me pay illustrators and improve future books and help me convince my wife that this is a good idea.

You can buy it here on Leanpub, it's only \$4.99 USD. <http://leanpub.com/probabilityforlemurs>.

The upside is that you will get updates as the book improves. If you're in a really tough spot and still really need the book, that's fine, I trust you. You can buy it for free at this [link here](#). This at least helps me track how many people are following along.

You could also help by [promoting my book on Twitter by clicking here if you wish](#). Thanks!

I would like to give a special thanks to those who helped make this book a success, either by reviewing scribbles and drawings, buying LeanPub copies early on, supporting me through the process, giving me tips on what to do or other ways I may not have even realized.

Wout Mertens • Andrea Salazar • Daniel Feldman • Vance Trendov • Justin Grammens •  
Daniel Acosta •

This book is Dedicated to my son,  
Sebastian Salazar Delaney.

# 00. Contents

Table of Contents Key:

Completed \* Incomplete \* Not Started

## Exploring Data

00. Contents

01. Numbers

02. Populations

03. Samples

04. Mean Value

05. Variance

06. Random Variables

07. Probability Density Function

08. Central Limit Theorem

09. Standard Deviation

10. Cumulative Distribution Function

11. Confidence Intervals

12. Other Distributions

13. Significance Level, P-Value

14. Probability Space

## Finding Relationships

15. Inference

16. Hypothesis Testing

17. Chi Squared Independence Test

18. t-Test

19. ANOVA

20. Regression Analysis

21. Pearson's R

22. Conditional Probability

23. Martingales

24. Correlation

## Predictions

25. Frequentist Probability

26. Expected Value

27. Binomial

28. Bayes' Theorem

29. Poisson Process

30. Markov Chains

31. Statistical Process Control

## Credits

32. Licenses to Graphics Used

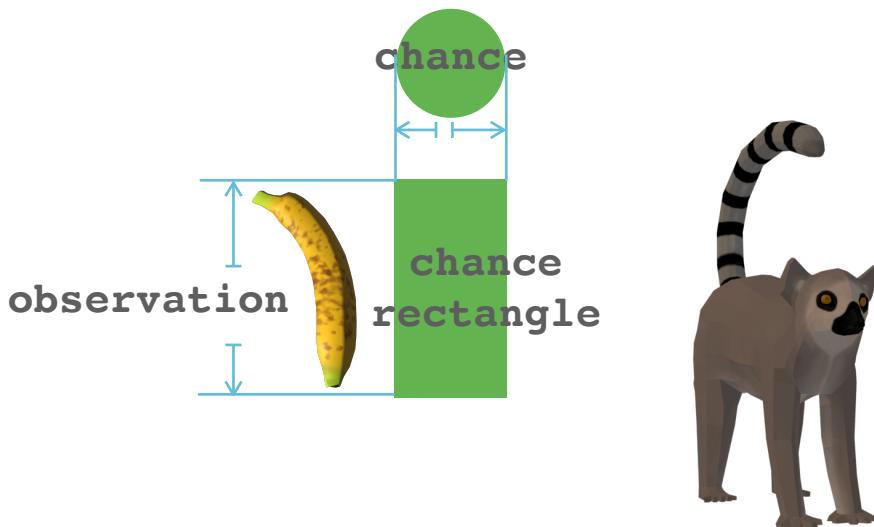
## 28. Bayes Theorem

Of course we have already covered that Lemurs like bananas. Unfortunately for lemurs, there are bugs that also like bananas. This can be a big problem for lemurs, especially since it is impossible to tell for sure whether a banana has a bug in it until after the banana has been opened.

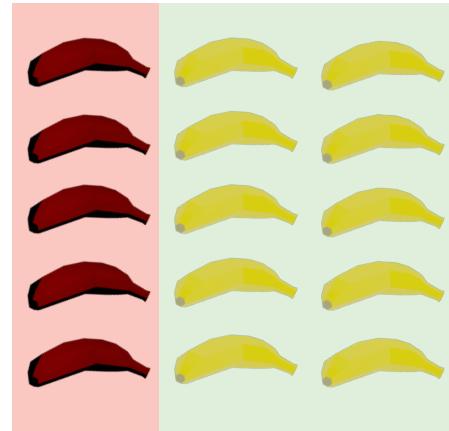


## 28. Bayes Theorem

We learned from Expected Values that the value of an Observation one can expect, or Probability, from a future output can possibly be based upon an input Chance value multiplied by measurements. When lemurs do this, they are creating a fictional idea about how the world works based upon frequencies of past Observations.



Categorical Data

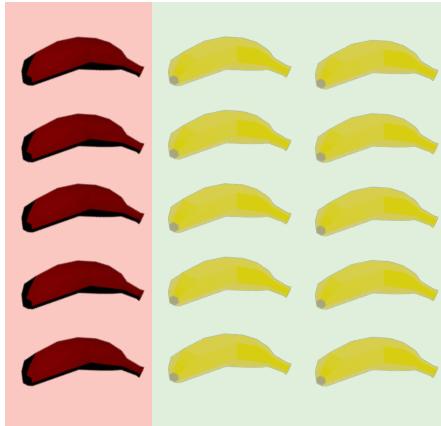


EV = 2/3 Good

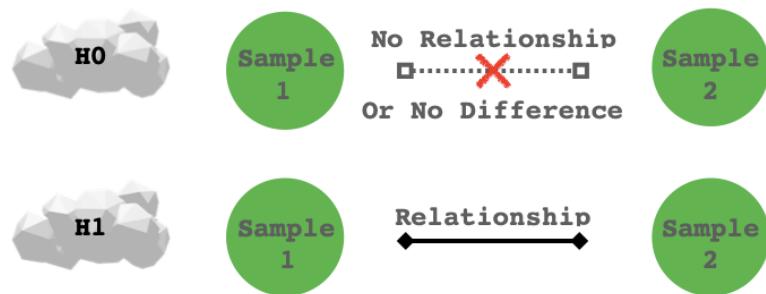
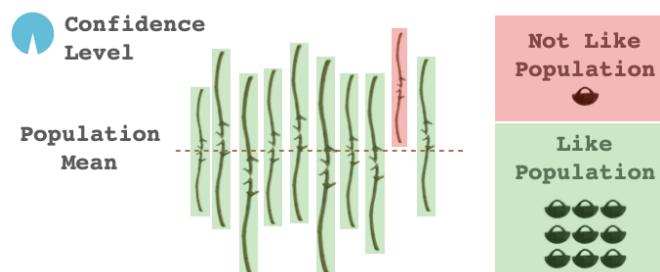
## 28. Bayes Theorem

**Using Categorical Data, the Expected Value from past Observations of bug-ridden and clear bananas might be  $2/3$ . There should always be another idea behind this type of thinking, that some kind of hypothesis testing and a confidence interval is included in this  $2/3$  Expected Value.**

### Categorical Data



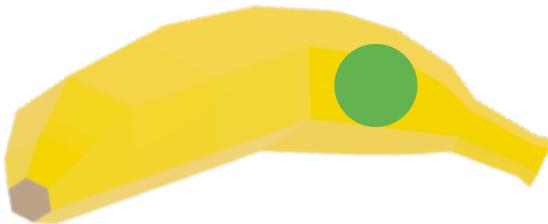
$$EV = 2/3 \text{ Good}$$



## 28. Bayes Theorem

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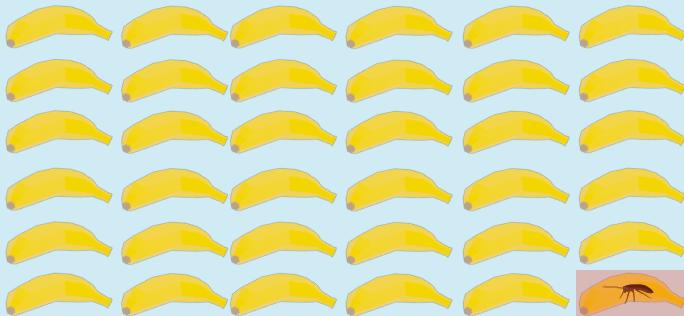
**In the case of Bayesian Probability there is however, a test that can be performed which basically gives a clue as to what level of certainty, called a Bayes factor, there may be bug inside the banana even before opening it. Instead of using hypothesis testing and confidence intervals as our clues, the clues are within the Observations.**



## 28. Bayes Theorem

**In a whole forest of bananas, what are the chances that you pick a banana with a bug in it, before you open the banana. Imagining that we have a test for bugs that doesn't always work.**

Chances of **Something**, Given **Experience** and a **Clue**



Base Rate =  $1/36$  bug

99% of time,  
spot  $\rightarrow$  bug



no spot  $\rightarrow$   
no bug

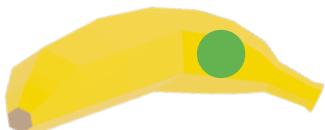


Bayes Factor

## 28. Bayes Theorem

**In a whole forest of bananas, we pick one banana. There is a spot on it, or not. There are actually two directions the clue can go.**

**Direction 1**



**The Bayes factor, or percent value of the clue could be different in each direction. But in our example here, the clue works 99% of the time in both directions.**

**Direction 2**



**99% of time,  
spot  $\rightarrow$  bug**  
**1% of time  
spot  $\rightarrow$  no bug**

**99% of time,  
no spot  $\rightarrow$  no bug**  
**1% of time  
no spot  $\rightarrow$  bug**

## 28. Bayes Theorem

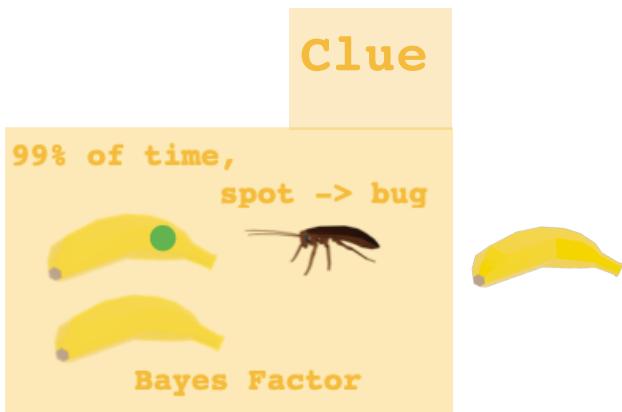
**There are four possible events that can happen that we know ahead of time.**

Possible Test Outcomes		
Clue	✓ Clue was Correct	✗ Clue was Incorrect
	No Bug	
		No Bug

## 28. Bayes Theorem

The **Clue** could actually have different values in different directions, but here it is 99% in both directions to keep things simple. So a banana with no spot means no bug 99% of the time, so the height of the rectangle is 99%. The width of the rectangle is  $35/36$  because this is the **Base Rate** from **Experience** out of 36 bananas, not taking into account any clue.

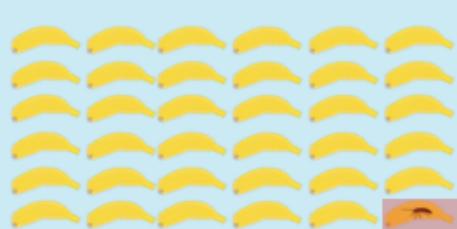
### Bayes Factor



### Experience

#### No Bug

0.9625



### Base Rate

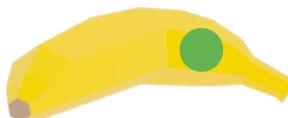
## 28. Bayes Theorem

**The concept of Types of Errors from Hypothesis Testing is kind of the same to Possible Test Outcomes in Bayesian thinking. But instead of the Error Type meaning incorrectly accepting or rejecting the Null Hypothesis, now it means the Clue was wrong.**

Types of Errors - Bayesian Probability		
Part of Error	Type 1	Type 2
Test Outcome	Clue Said Yes, But Was Wrong	Clue Said No, But was Wrong
Our Prediction based upon Refutation	We predicted Yes because clue showed us most likely Yes.	We predicted No because clue showed us most likely No.
Reality	Clue was wrong - False Positive.	Clue was wrong - False Negative.

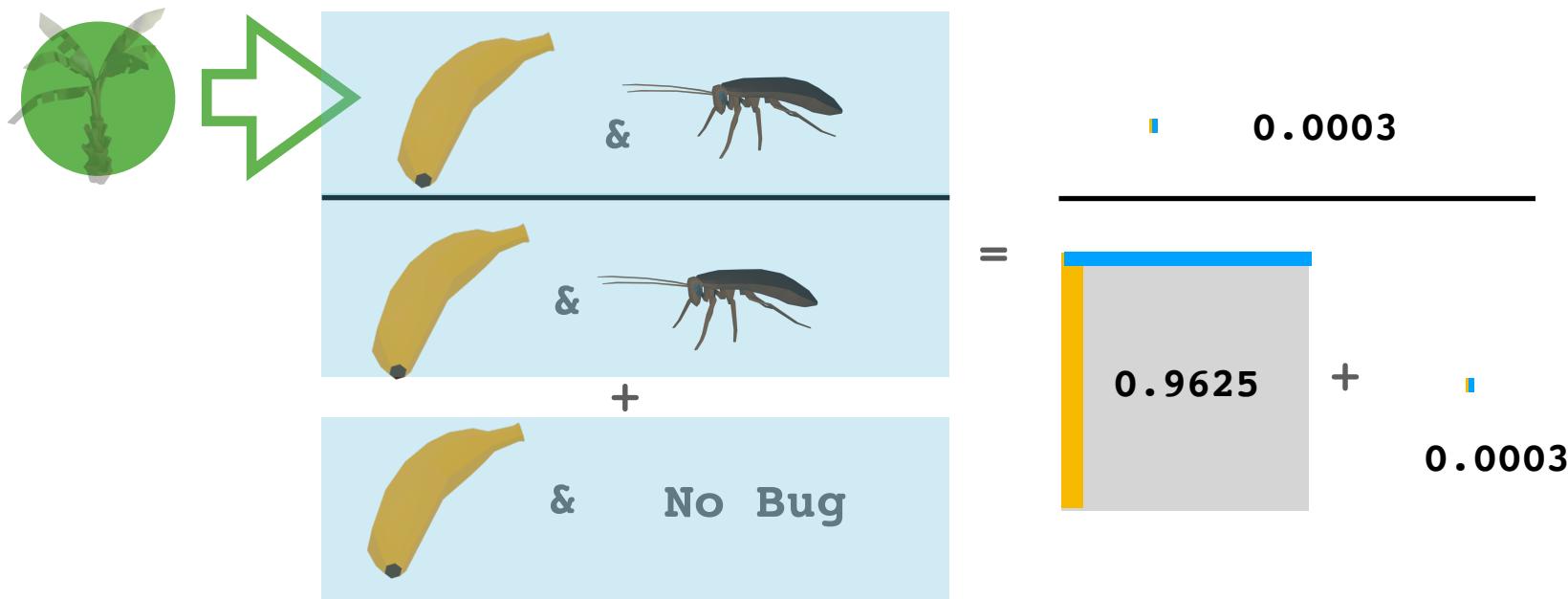
## 28. Bayes Theorem

To make things easier for lemurs, we can look at each of the **Base Cases** vs the **Clues** put near each other on a table.

		Experience	
Clue		1/36	No Bug 35/36
99% correct 1% not correct		0.000278	0.9625
99% correct 1% not correct		0.0257	0.0097

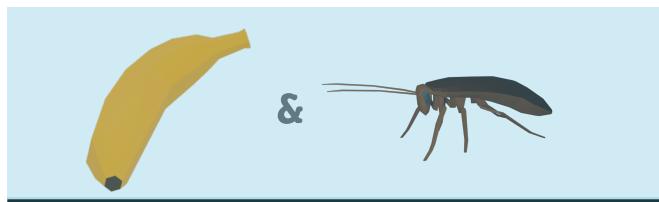
## 28. Bayes Theorem

**Out of a whole forest of bananas, we pick one banana. Look at it and see there is no green spot. What are the chances it has a bug? It's not 1 in 36 anymore because we know there is no spot. It's not 0% because we know the test is not perfect.**



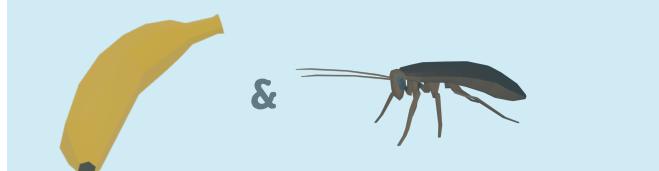
## 28. Bayes Theorem

To find the accurate result, which is still small, we have to divide the chance of no spot and a bug by the sum of no spot and a bug plus no spot and no bug. These might seem like small numbers, but there is a 4% difference between 0.000278 and 0.000289!



=

0.000278



=

0.000289...

+



+

0.000278

## 28. Bayes Theorem

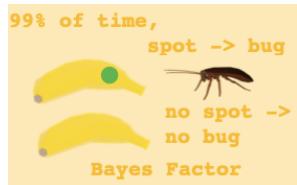
**This final calculation including both the base case and the clue shows us the real risk. Using just experience or just the clue would be much too fearful.**

0.0289% is the risk in reality



$$1/36 = 2.78\%$$

96 times too  
fearful

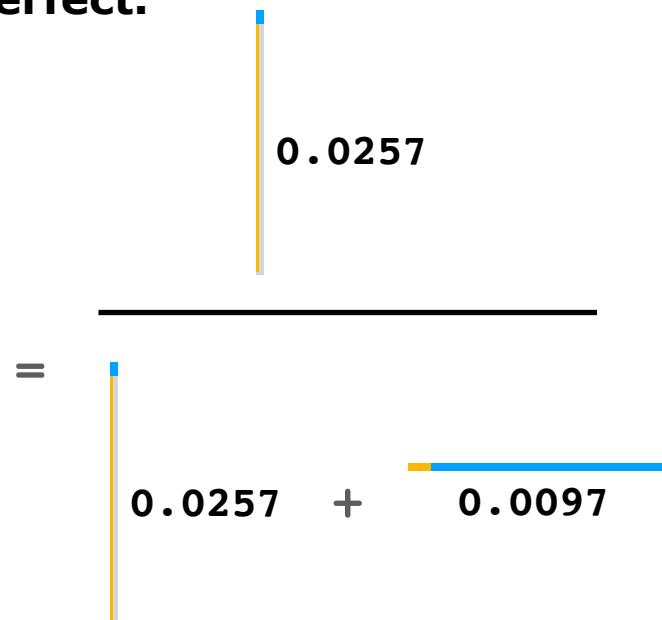
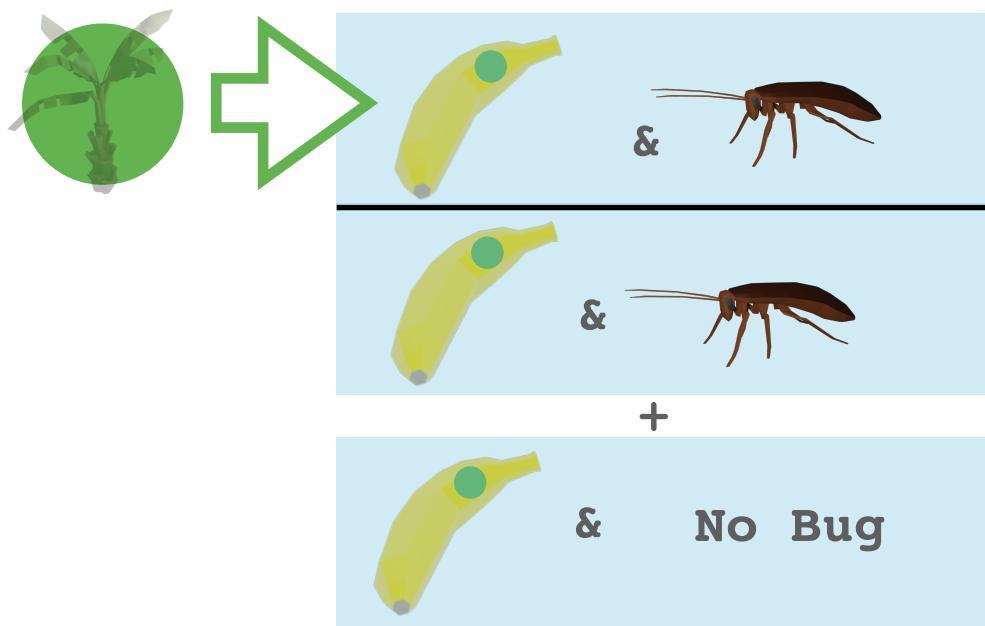


$$1/100 = 1.00\%$$

35 times too  
fearful

## 28. Bayes Theorem

**Out of a whole forest of bananas, we pick one banana. Look at it and see there is a green spot. What are the chances it has a bug? It's not 1 in 36 anymore because we know there is a spot. It's not 100% because we know the test is not perfect.**



## 28. Bayes Theorem

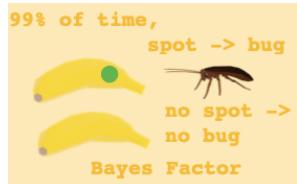
**This final calculation including both the base case and the clue shows us the real risk. Using just experience or just the clue would be much too fearful.**

72.60% is the risk in reality



$$35/36 = 97.2\%$$

1.3 times too confident



$$99/100 = 99.0\%$$

1.4 times too confident

## 28. Bayes Theorem



Crate of 1000 bananas marked to be thrown out because of spots.



72.60%

\*

1000

=

726

Have Bugs

Bayesian Bug Probability

274

Would have been wasted!

## 29. Poisson Process

**Some lemurs eat coconuts. These nocturnal lemurs, called Aye-ayes, can listen for the sound of coconuts falling and hitting the ground at night.**

Sunset



Night



Sunrise



*Thunk!*



*Thunk!*



*Thunk!*



*Thunk!*



## 30. Markov Chains

**Lemurs are good at leaping. But, they can't leap across a whole forest in one jump. They leap from tree to tree, using the trees or banana plants that are within leaping distance.**

