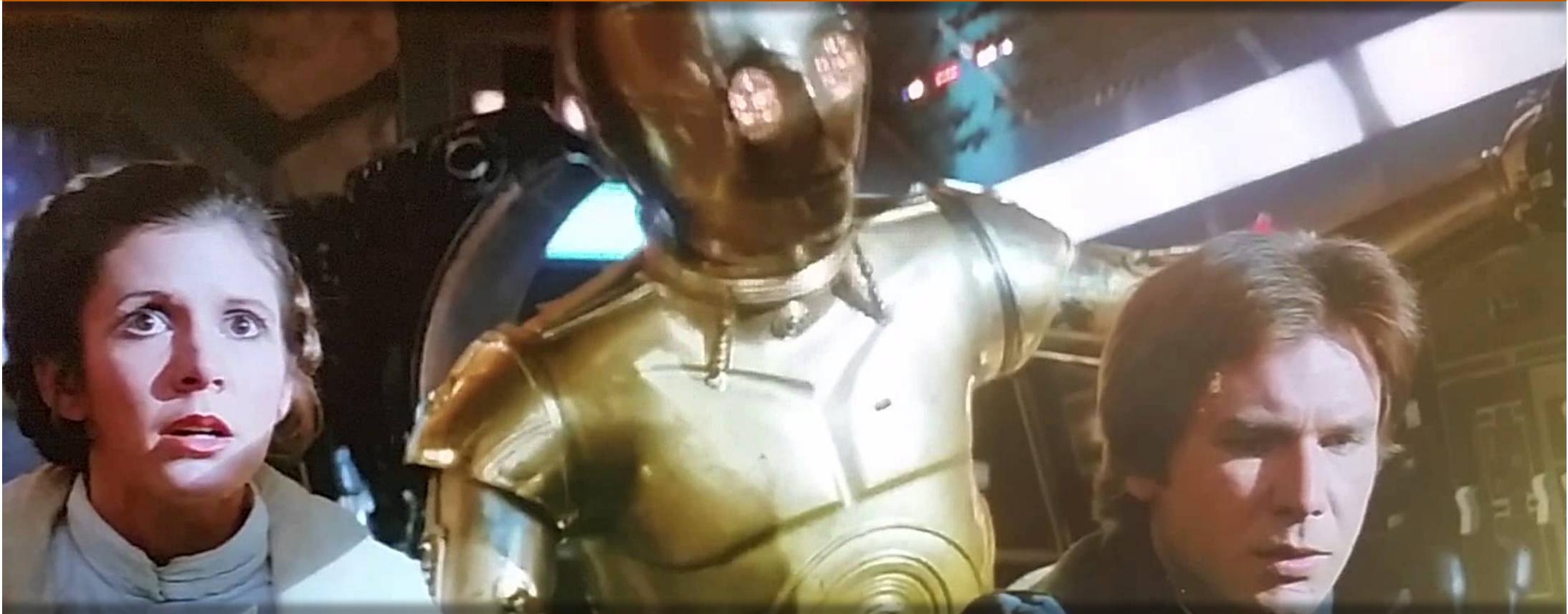


# SOEE1475 Statistics and Data Analysis

## Lecture 1: Probability



Graeme T. Lloyd



# Lesson #1

| $x$ | $y$  |
|-----|------|
| 10  | 9.14 |
| 8   | 8.14 |
| 13  | 8.74 |
| 9   | 8.77 |
| 11  | 9.26 |
| 14  | 8.10 |
| 6   | 6.13 |
| 4   | 3.10 |
| 12  | 9.13 |
| 7   | 7.26 |
| 5   | 4.74 |

**Model A**

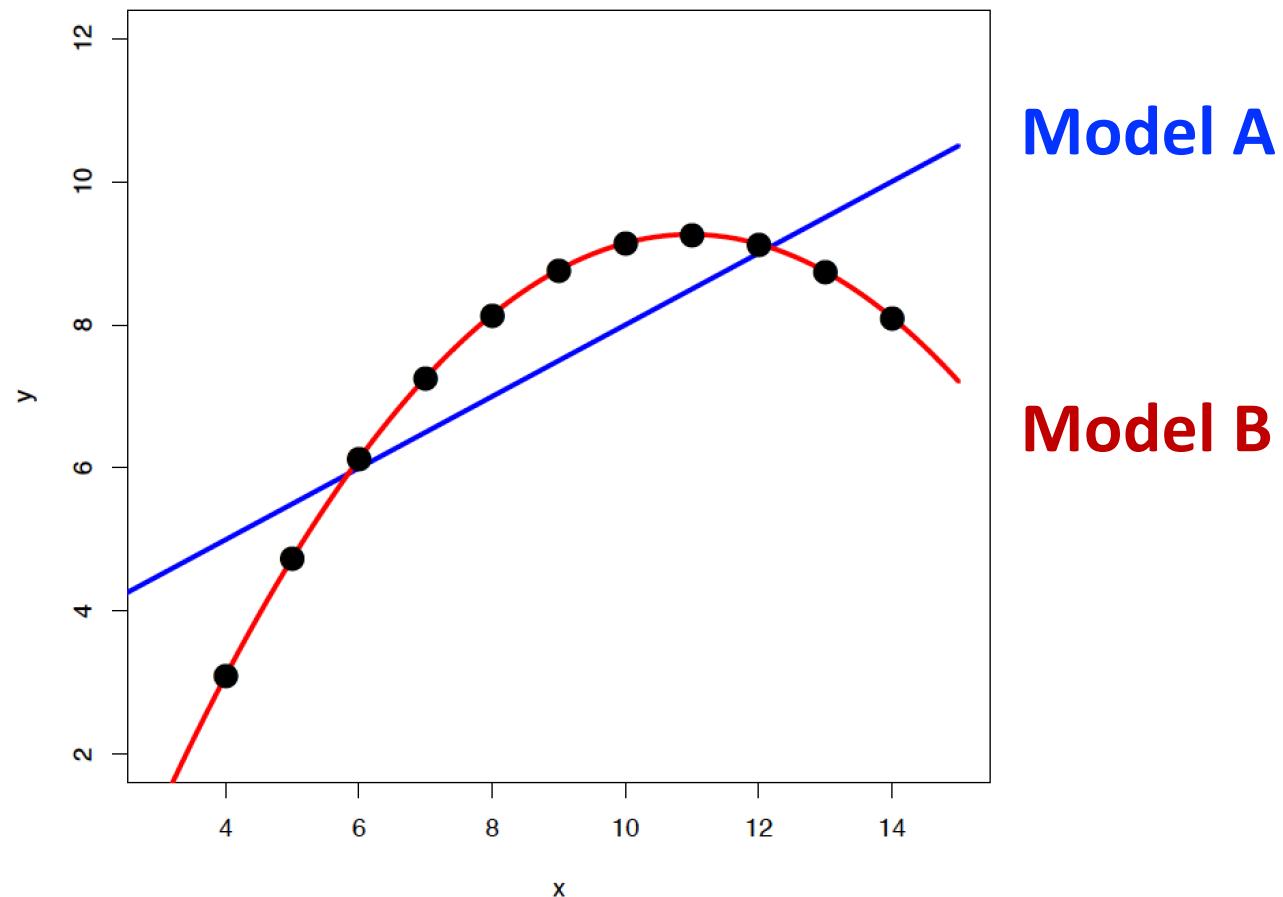
$$y = 0.5x + 3$$

**Model B**

$$y = 0.1267x^2 + 2.7808x - 6$$



# Lesson #1





# Lesson #1

Always plot your data



# Lesson #2

| $x$ | $y$   |
|-----|-------|
| 10  | 7.46  |
| 8   | 6.77  |
| 13  | 12.74 |
| 9   | 7.11  |
| 11  | 7.81  |
| 14  | 8.84  |
| 6   | 6.08  |
| 4   | 5.39  |
| 12  | 8.15  |
| 7   | 6.42  |
| 5   | 5.73  |

## Model

$$y = 0.5x + 3$$

## “Goodness”

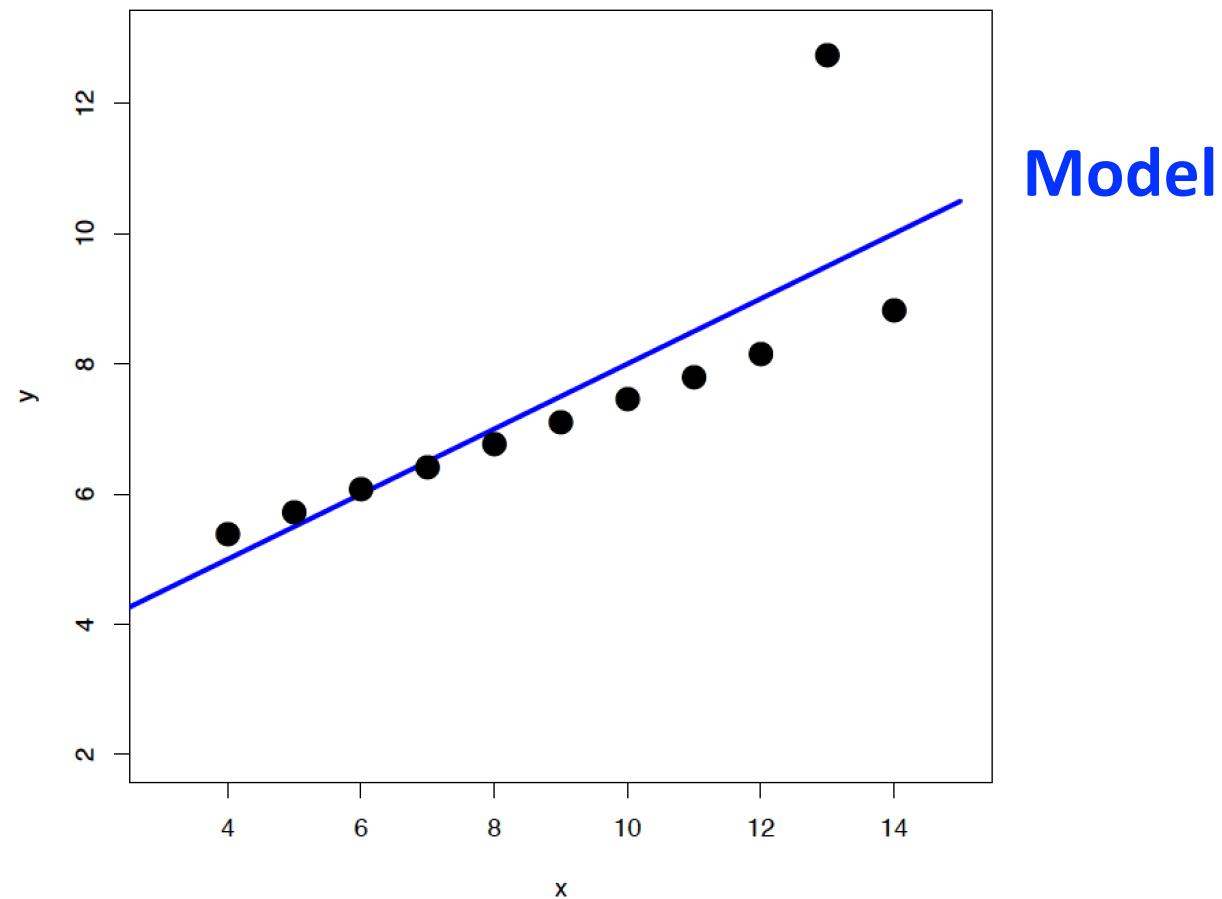
0.816

## “Chanceness”

0.002176



# Lesson #2





## Lesson #2

Statistics isn't a substitute for  
thinking about your data



# Today

- Introduction to probability
- Probability distributions
- The binomial, uniform, and normal distributions



# Probability: nomenclature



$$p(\text{Rain}) = 0.2$$



# Probability: rules

$$0 \leq p(\text{Anything}) \leq 1$$

$$p(\text{Outcome A}) + p(\text{Outcome B}) + \dots = 1$$

$$p(\text{Rain}) + p(\text{No rain}) = 1$$



# Probability: expectation

- Informed by a model

$$p(\text{Heads}) = 0.5$$



$$p(6) = 1/6$$



1



# Probability: expectation

## OR / Addition rule

$$p(\text{Rolling 5}) \text{ OR } p(\text{Rolling 6}) = p(5) + p(6) = 1/6 + 1/6 = 1/3$$

## AND / Multiplication rule

$$p(\text{Rolling 6}) \text{ AND } p(\text{Rolling 6}) = p(6) \times p(6) = 1/6 \times 1/6 = 1/36$$



# Probability: inference

- Informed by empirical data

| Eastern Conference |                     |    |    |      |      |         |         |         |         |        |       |       |      |
|--------------------|---------------------|----|----|------|------|---------|---------|---------|---------|--------|-------|-------|------|
| RANK               | NAME                | W  | L  | PCT  | GB   | CONF    | HOME    | ROAD    | LAST 10 | STREAK | PF    | PA    | DIFF |
| 01                 | Milwaukee Bucks     | 43 | 7  | 86.0 | 0    | 26 - 3  | 23 - 3  | 20 - 4  | 9-1     | Won 2  | 120.0 | 107.6 | 12.4 |
| 02                 | Toronto Raptors     | 37 | 14 | 72.5 | 6.5  | 27 - 7  | 19 - 7  | 18 - 7  | 10-0    | Won 12 | 112.7 | 106.1 | 6.6  |
| 03                 | Boston Celtics      | 35 | 15 | 70.0 | 8    | 24 - 9  | 21 - 5  | 14 - 10 | 8-2     | Won 5  | 112.7 | 105.4 | 7.3  |
| 04                 | Miami Heat          | 34 | 16 | 68.0 | 9    | 23 - 7  | 22 - 3  | 12 - 13 | 6-4     | Lost 1 | 112.2 | 108.3 | 3.9  |
| 05                 | Indiana Pacers      | 31 | 20 | 60.8 | 12.5 | 19 - 13 | 18 - 7  | 13 - 13 | 5-5     | Lost 3 | 109.6 | 107.1 | 2.5  |
| 06                 | Philadelphia Sixers | 31 | 20 | 60.8 | 12.5 | 21 - 13 | 22 - 2  | 9 - 18  | 6-4     | Lost 3 | 108.4 | 106.1 | 2.3  |
| 07                 | Brooklyn Nets       | 23 | 27 | 46.0 | 20   | 15 - 15 | 15 - 12 | 8 - 15  | 5-5     | Won 2  | 110.7 | 111.4 | -0.7 |
| 08                 | Orlando Magic       | 22 | 29 | 43.1 | 21.5 | 15 - 15 | 13 - 12 | 9 - 17  | 2-8     | Lost 1 | 103.3 | 104.8 | -1.5 |
| 09                 | Chicago Bulls       | 19 | 33 | 36.5 | 25   | 13 - 22 | 11 - 15 | 8 - 18  | 4-6     | Lost 3 | 105.9 | 108.7 | -2.8 |
| 10                 | Detroit Pistons     | 19 | 34 | 35.8 | 25.5 | 12 - 25 | 11 - 17 | 8 - 17  | 3-7     | Won 1  | 108.9 | 111.3 | -2.4 |
| 11                 | Washington Wizards  | 17 | 32 | 34.7 | 25.5 | 12 - 19 | 11 - 12 | 6 - 20  | 4-6     | Lost 1 | 115.7 | 120.8 | -5.1 |
| 12                 | Charlotte Hornets   | 16 | 35 | 31.4 | 27.5 | 11 - 20 | 8 - 16  | 8 - 19  | 1-9     | Lost 4 | 103.0 | 110.8 | -7.8 |
| 13                 | New York Knicks     | 15 | 36 | 29.4 | 28.5 | 10 - 22 | 7 - 18  | 8 - 18  | 4-6     | Won 2  | 104.5 | 111.7 | -7.2 |
| 14                 | Atlanta Hawks       | 14 | 38 | 26.9 | 30   | 7 - 25  | 8 - 17  | 6 - 21  | 4-6     | Won 1  | 109.5 | 118.3 | -8.8 |
| 15                 | Cleveland Cavaliers | 13 | 39 | 25.0 | 31   | 8 - 28  | 6 - 21  | 7 - 18  | 1-9     | Lost 5 | 106.0 | 114.8 | -8.8 |



# Probability expectation: coin flips

$$p(\text{Heads}) = 0.5$$





# Probability expectation: coin flips

## Exercise



# Probability inference: coin flips

## Exercise

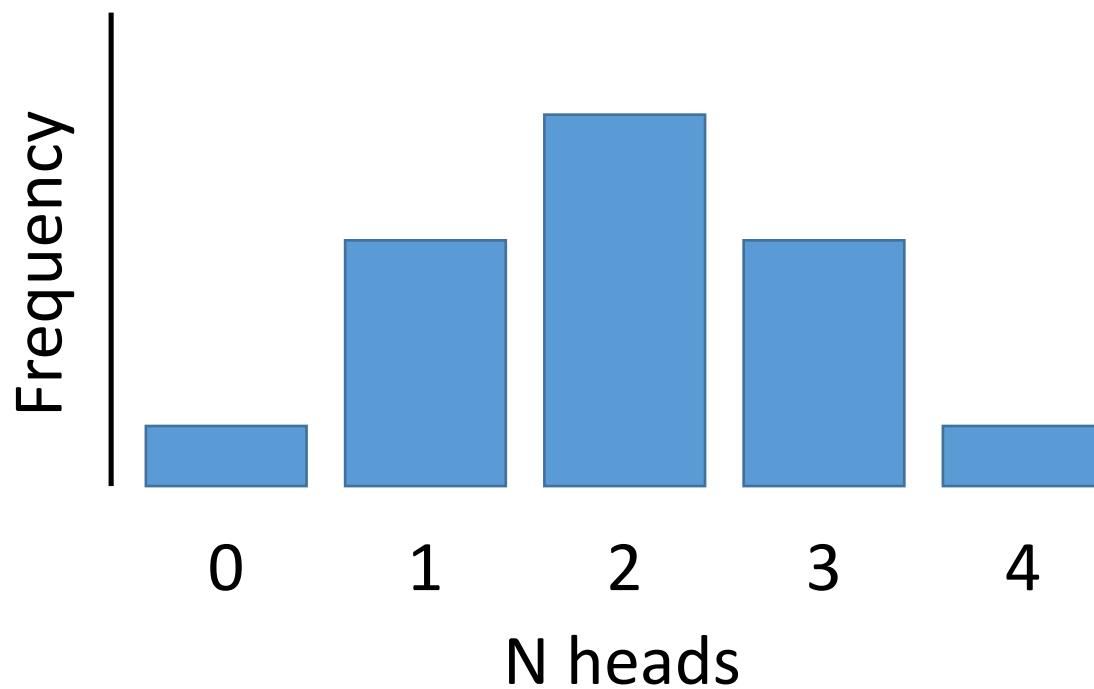


# Probability inference: coin flips

|      |      |         |      |      |
|------|------|---------|------|------|
|      |      | HHTT    |      |      |
|      |      | HTHT    |      |      |
|      | HTTT | HTTH    | THHH |      |
|      | THTT | THHT    | HTHH |      |
|      | TTHT | THTH    | HHTH |      |
| TTTT | TTTH | TTHH    | HHHT | HHHH |
| 0    | 1    | 2       | 3    | 4    |
|      |      | N heads |      |      |



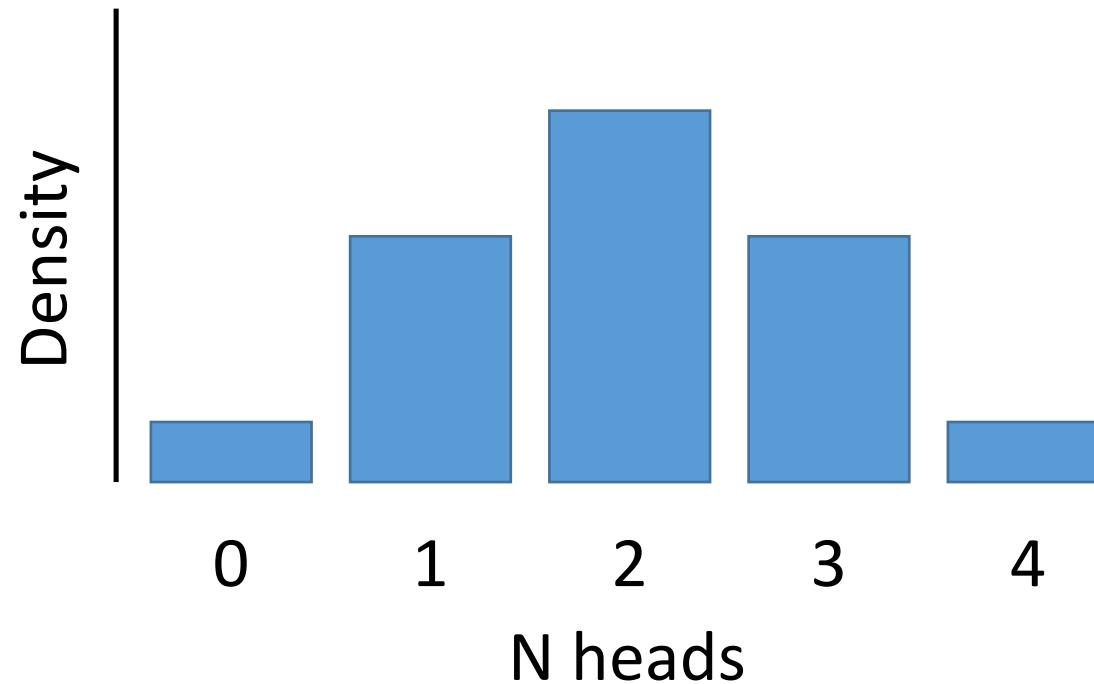
# Probability distributions





# Probability distributions

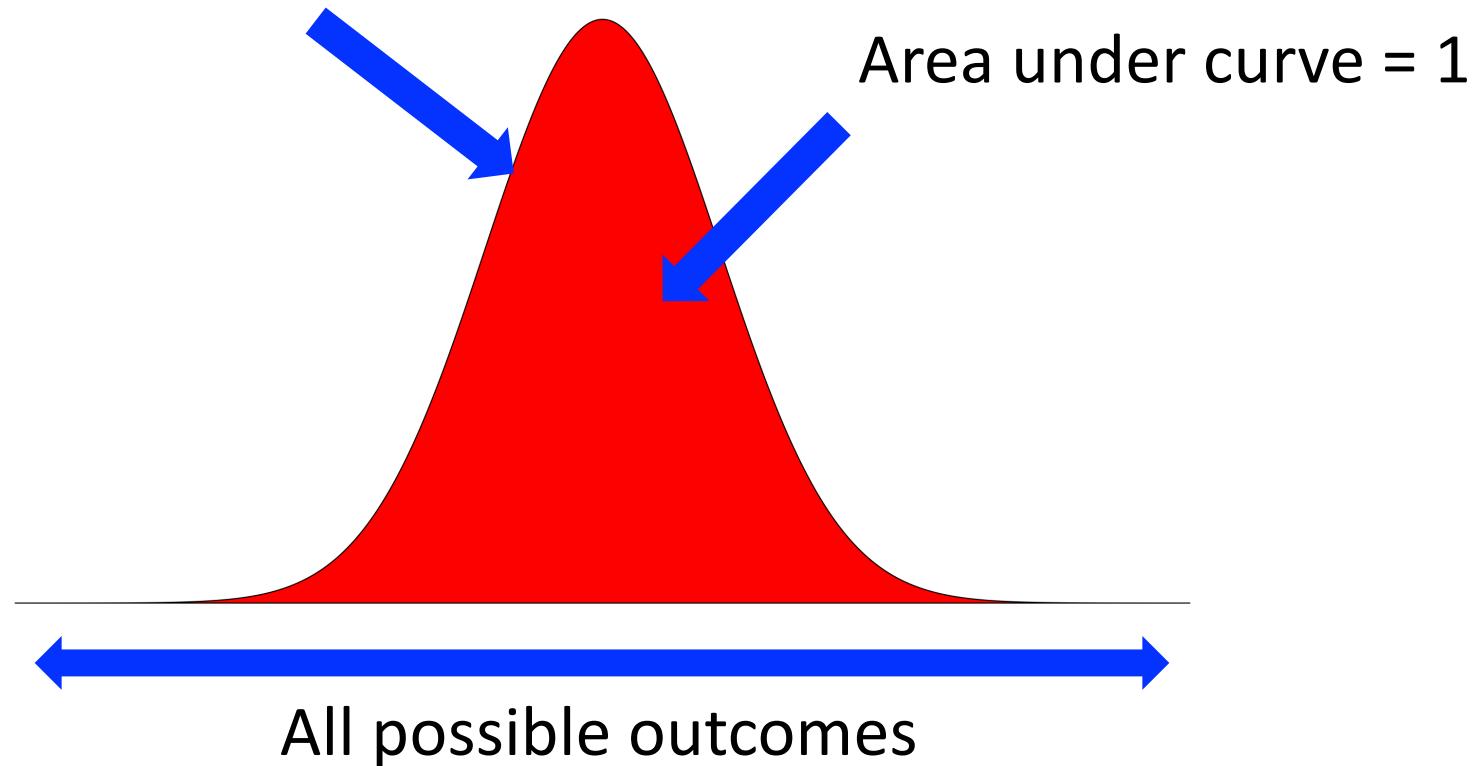
$$p(0) + p(1) + p(2) + p(3) + p(4) = 1$$





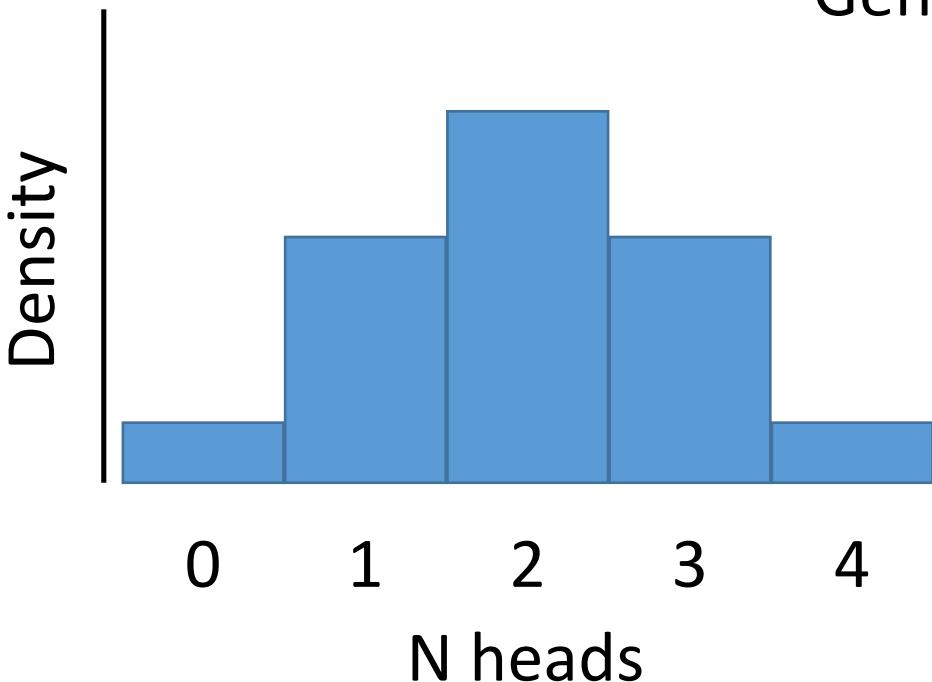
# Probability distributions: features

Shape of curve defined by an equation  
(the **Probability Density Function**)





# Probability distributions: the binomial



Generalizable to any two outcome scenario

## Probability Density Function (PDF)

$$P(X = k) = \binom{n}{k} p^k (1 - p)^{n-k}$$

Where  $k$  = specific outcome (e.g., 2 Heads)

$n$  = number of trials (e.g., 4 flips)

$p$  = probability of success (e.g., Heads)



```
dbinom(x = k, size = n, prob = p)
```

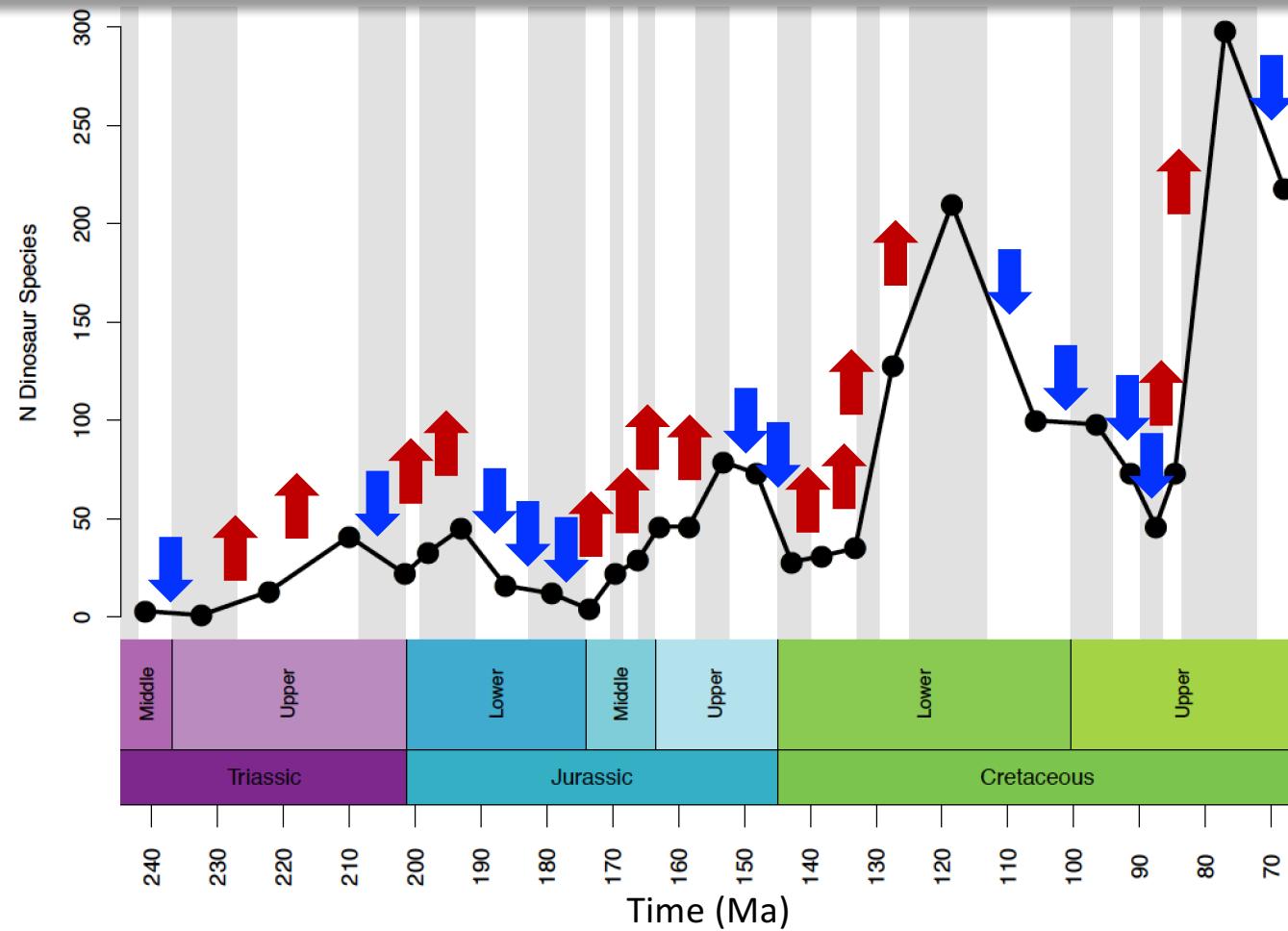


# Applying the binomial

*Q: Are changes in the number of dinosaur species through the Mesozoic distinguishable from flipping a fair coin?*

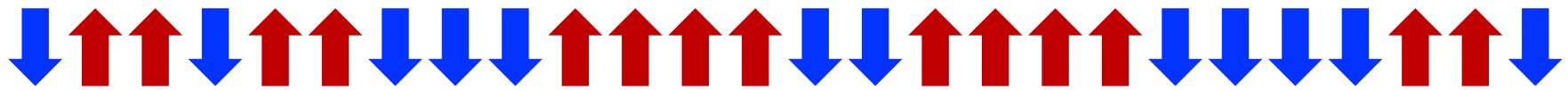


# Applying the binomial





# Applying the binomial



x 12



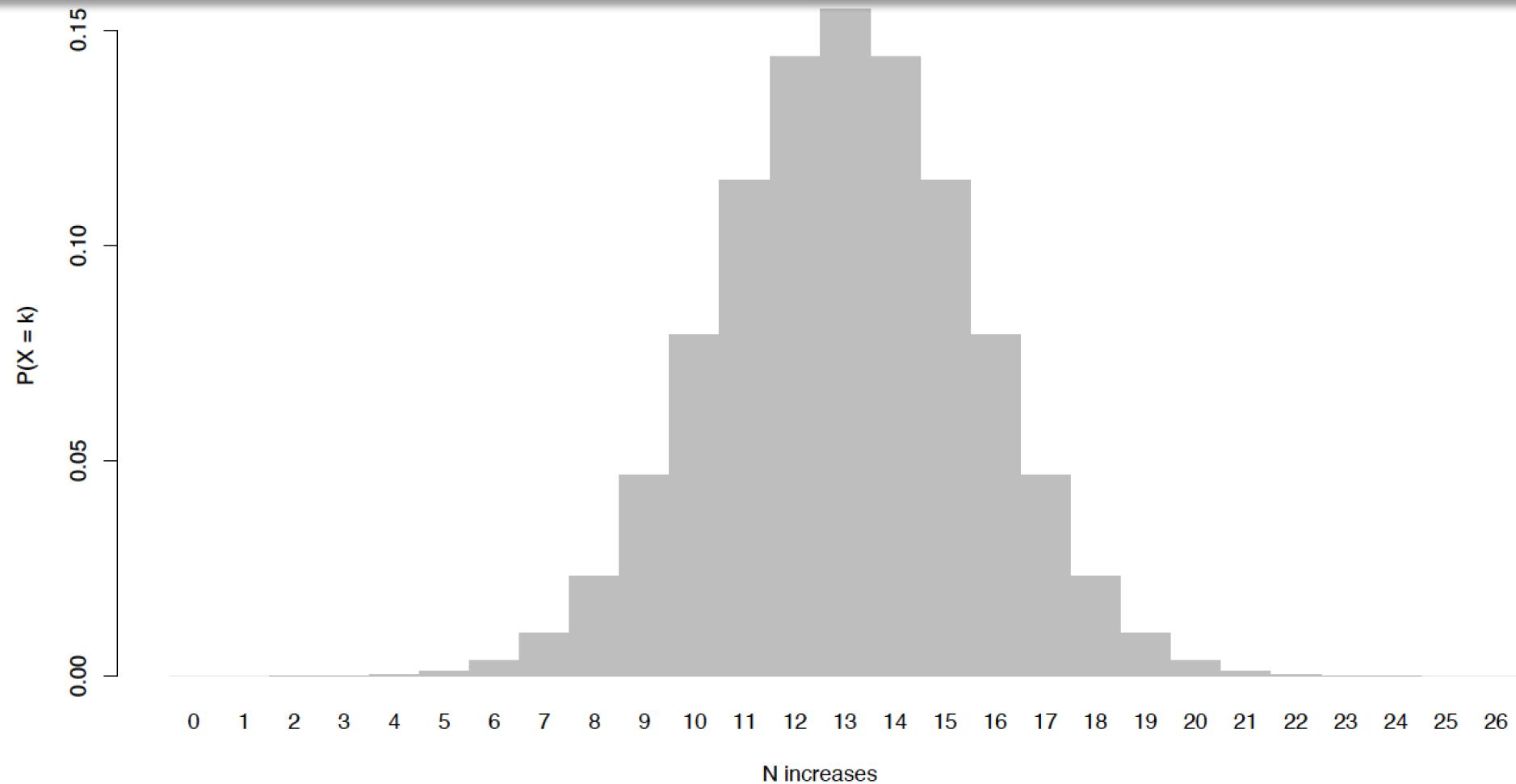
x 14



```
dbinom(x = c(0:26), size = 26, prob = 0.5)
```

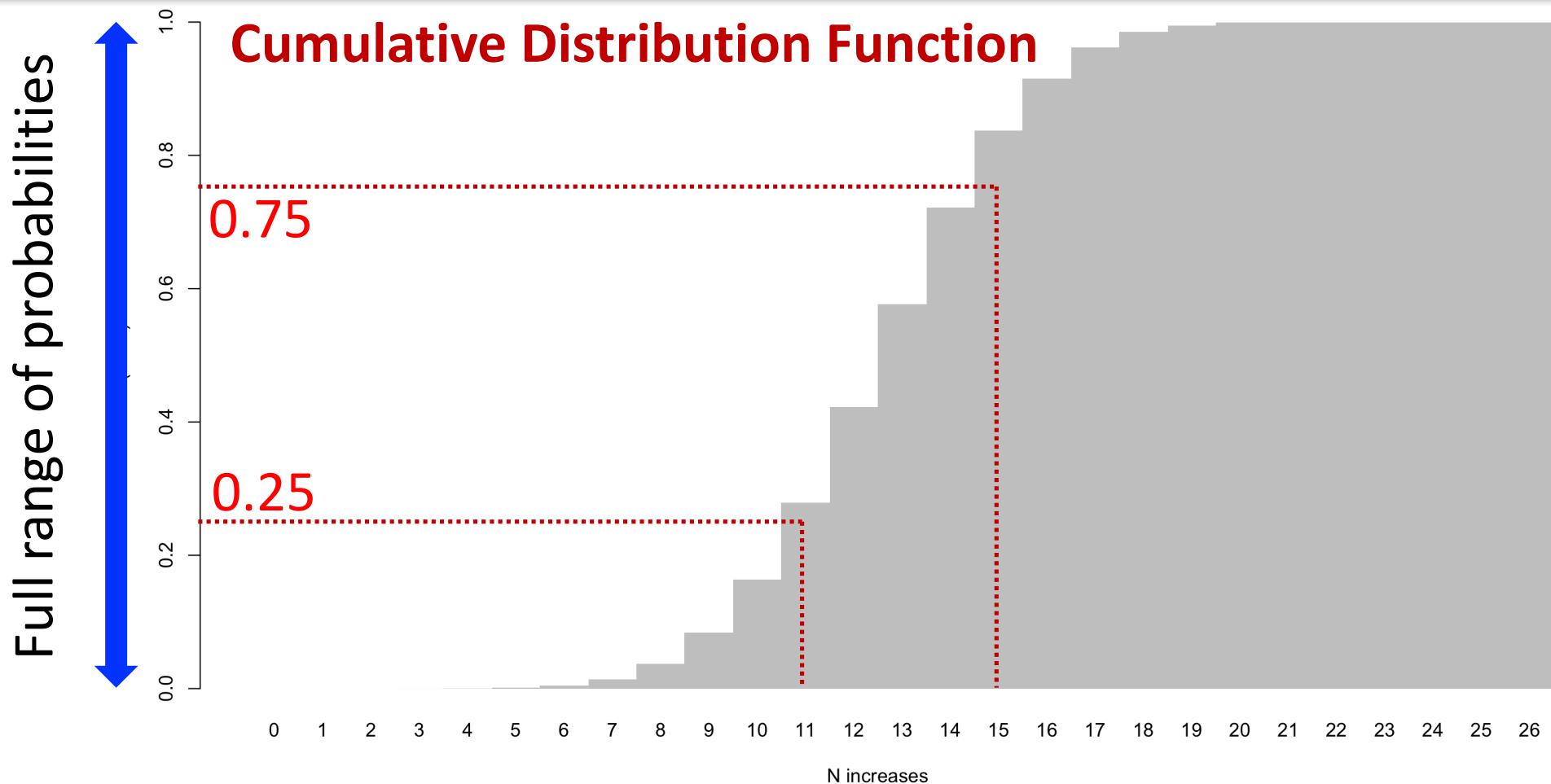


# Applying the binomial



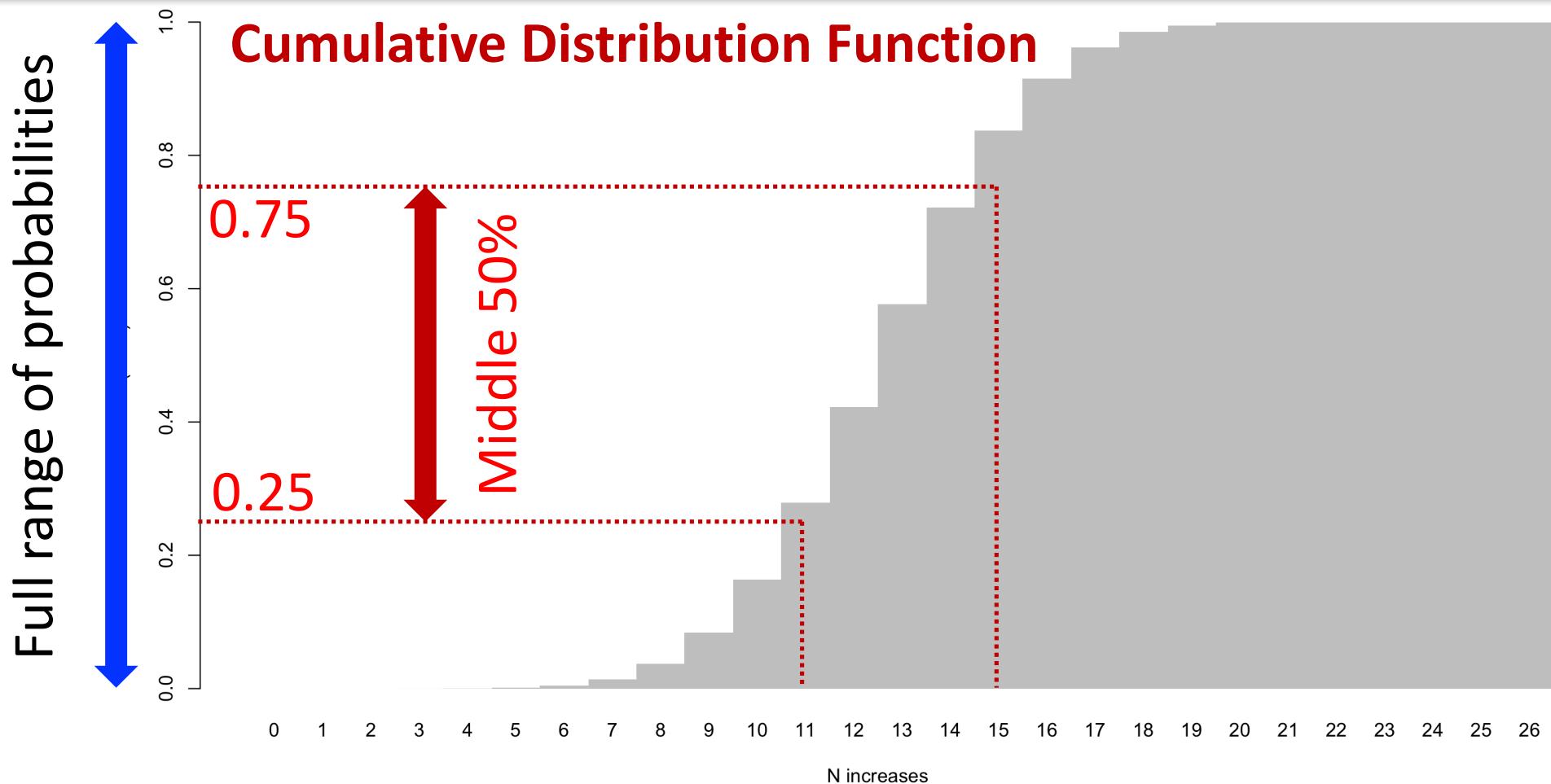


# Probability distributions



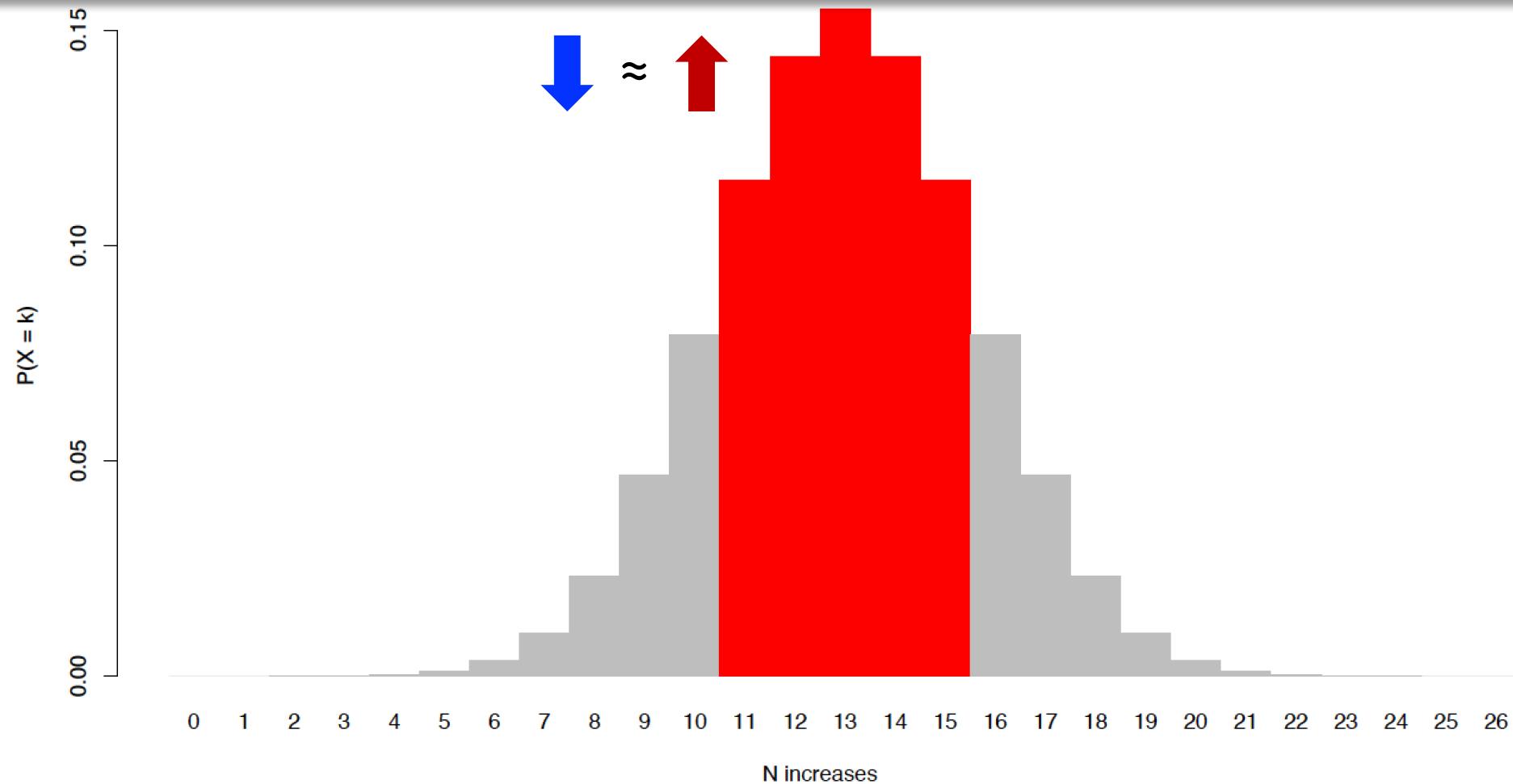


# Probability distributions



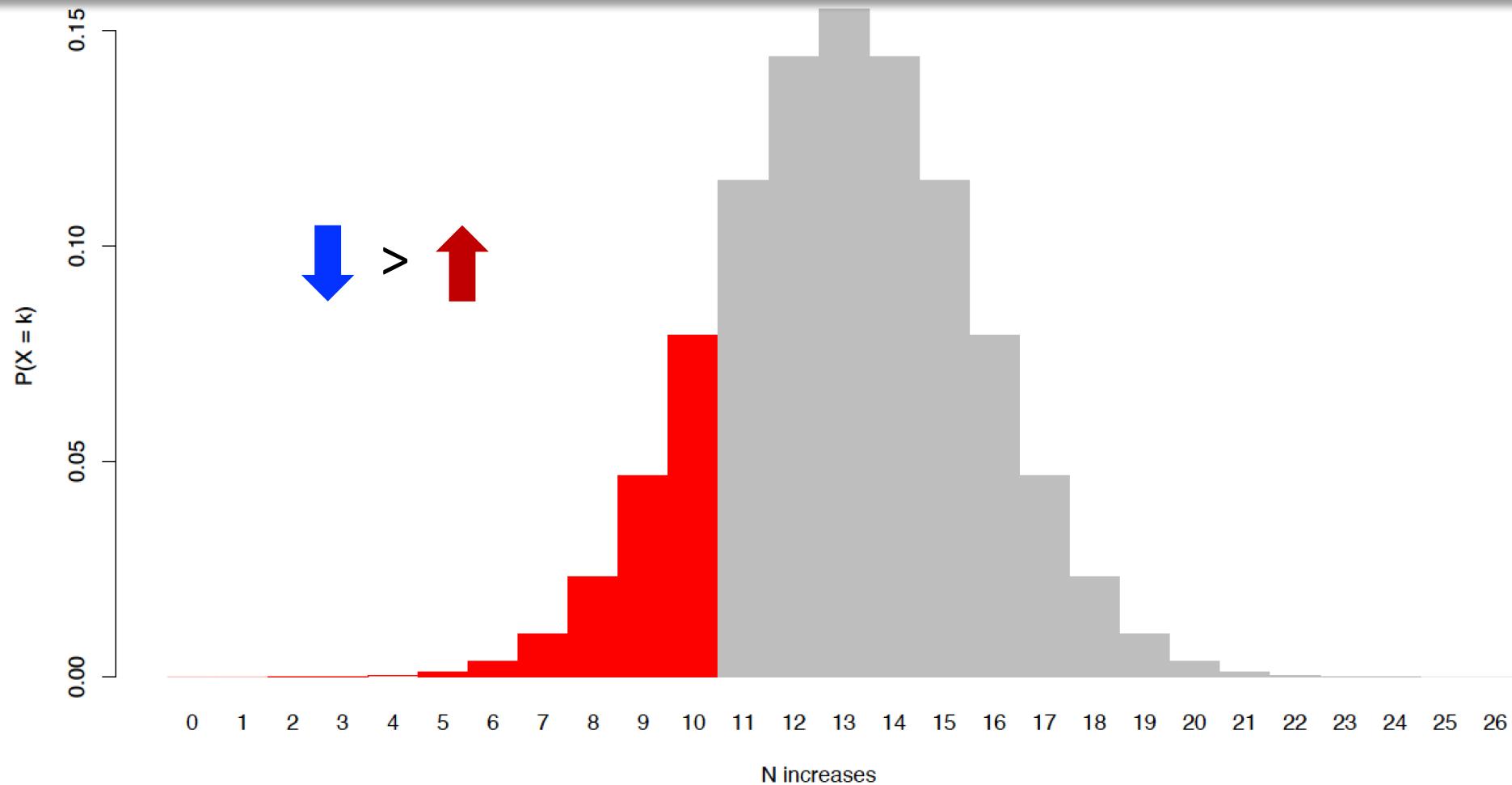


# Applying the binomial



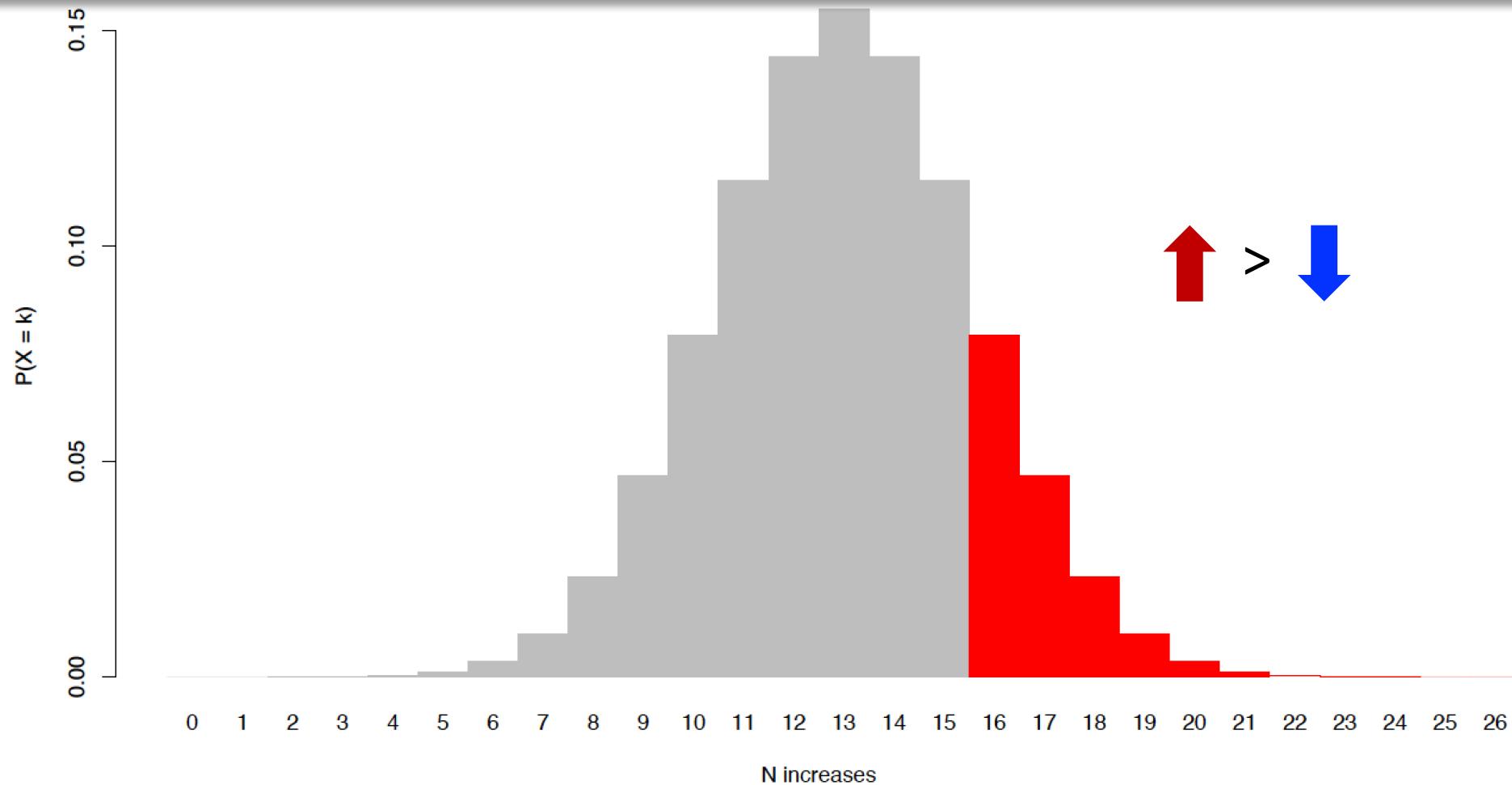


# Applying the binomial



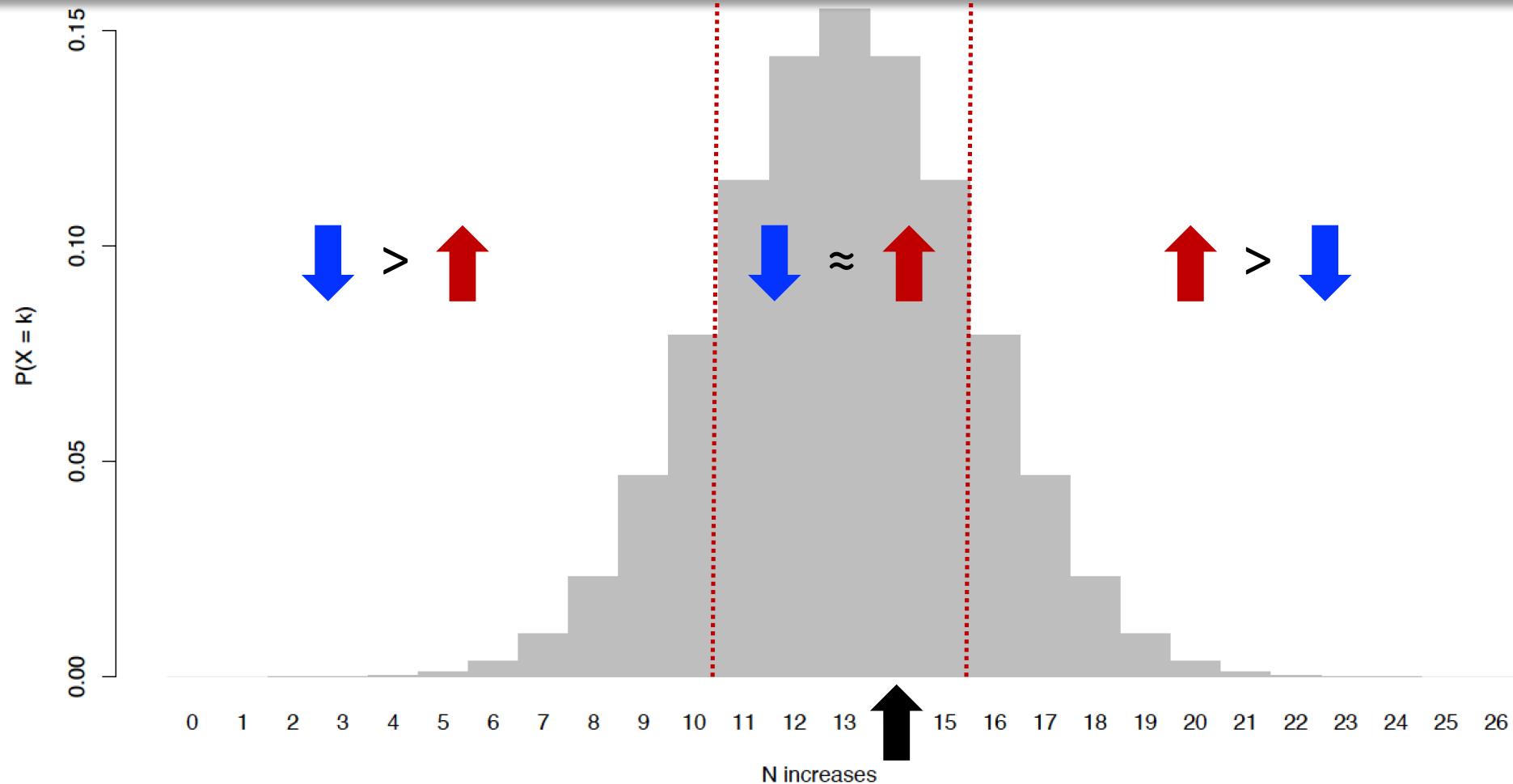


# Applying the binomial





# Applying the binomial





## Applying the binomial

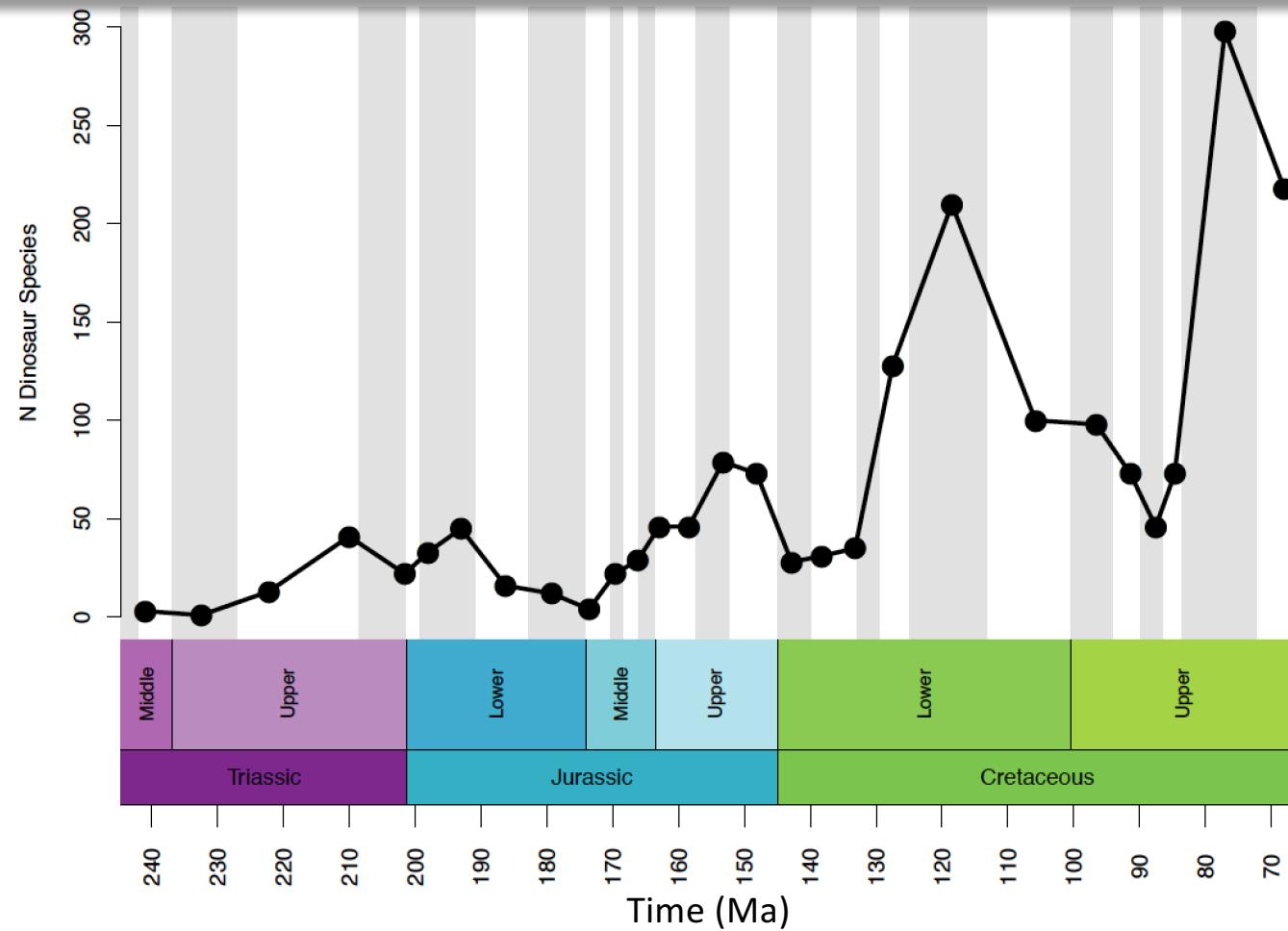
*Stage-to-stage changes in the number of dinosaur species  
are indistinguishable from random coin flips*

or

*There is no clear bias towards increases (or decreases) in  
dinosaur species number through the Mesozoic*



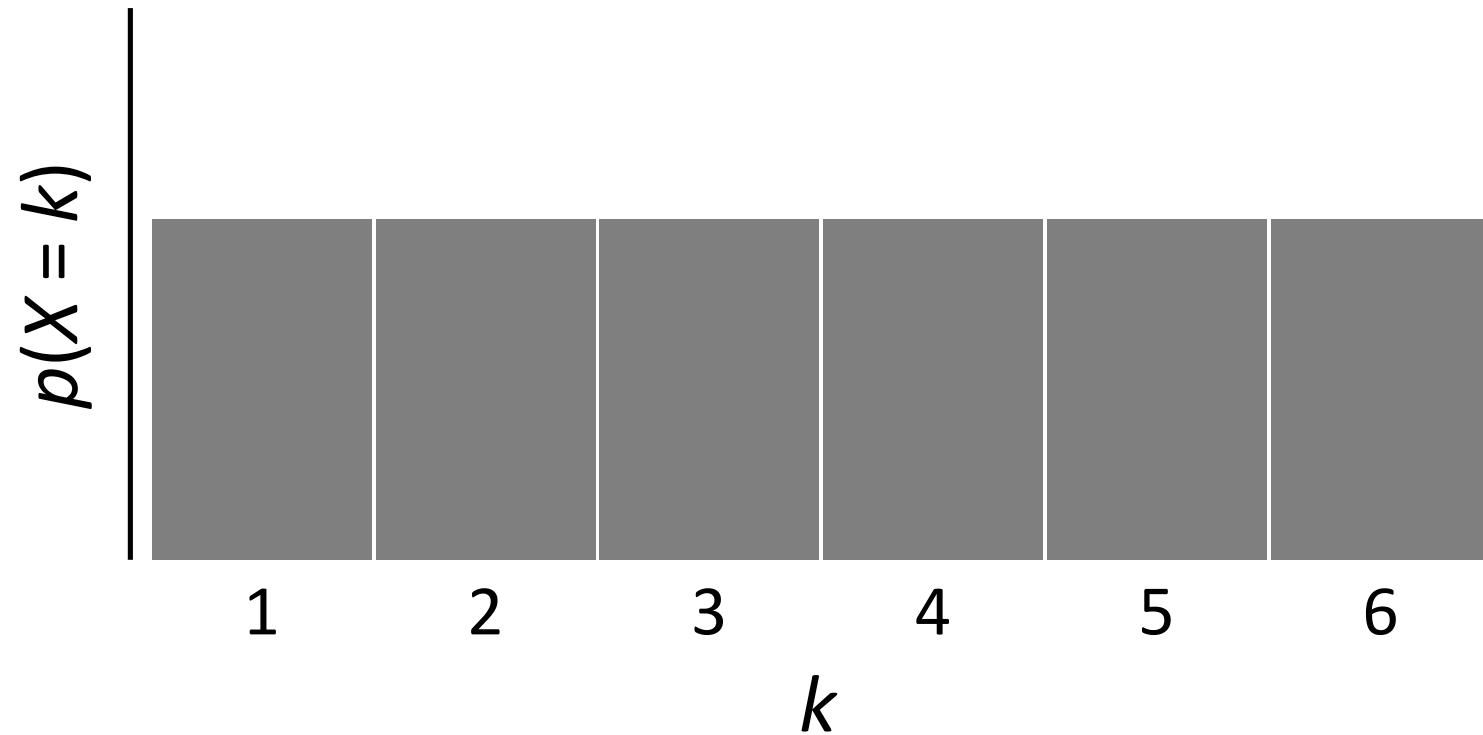
# Applying Lesson #2





# Rolling dice: expectation

$$p(1) = p(2) = p(3) = p(4) = p(5) = p(6) = 1/6$$





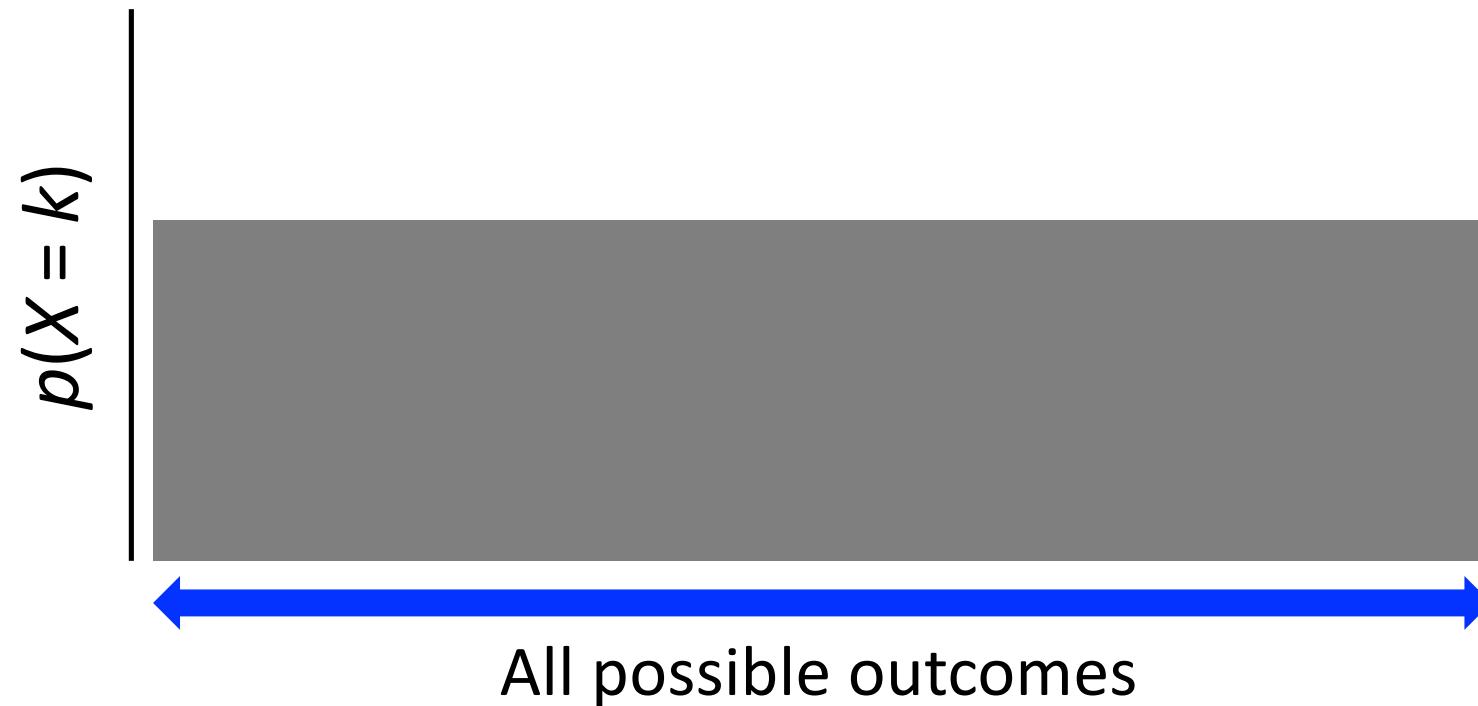
# Rolling dice: inference

## Exercise



# Probability distributions: the uniform

$$p(\text{Any outcome}) = p(\text{Any other outcome})$$



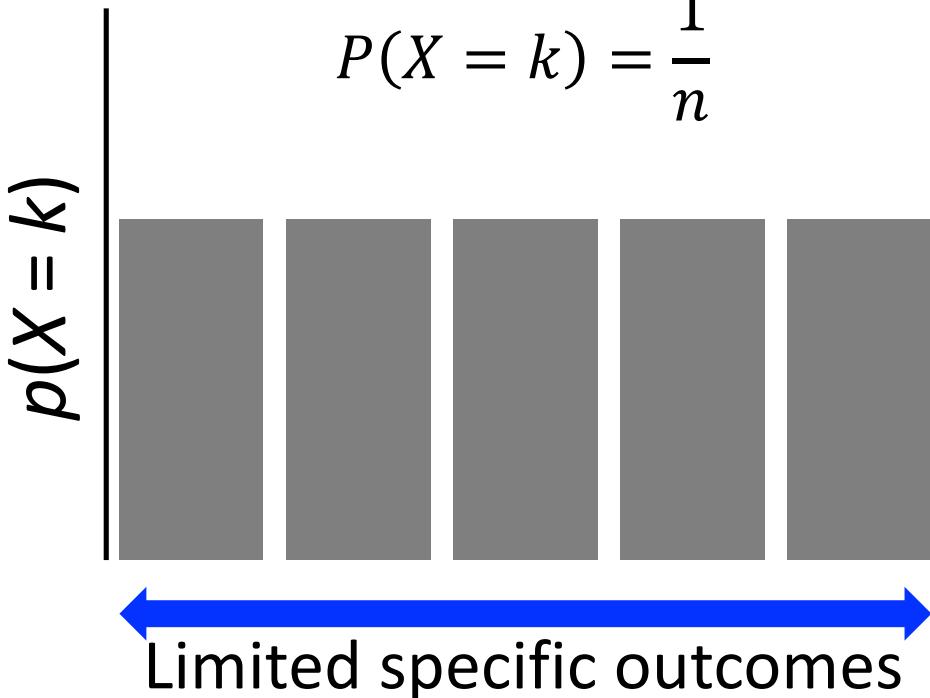


# Probability distributions: discrete vs continuous

## Discrete

(e.g., discrete uniform)

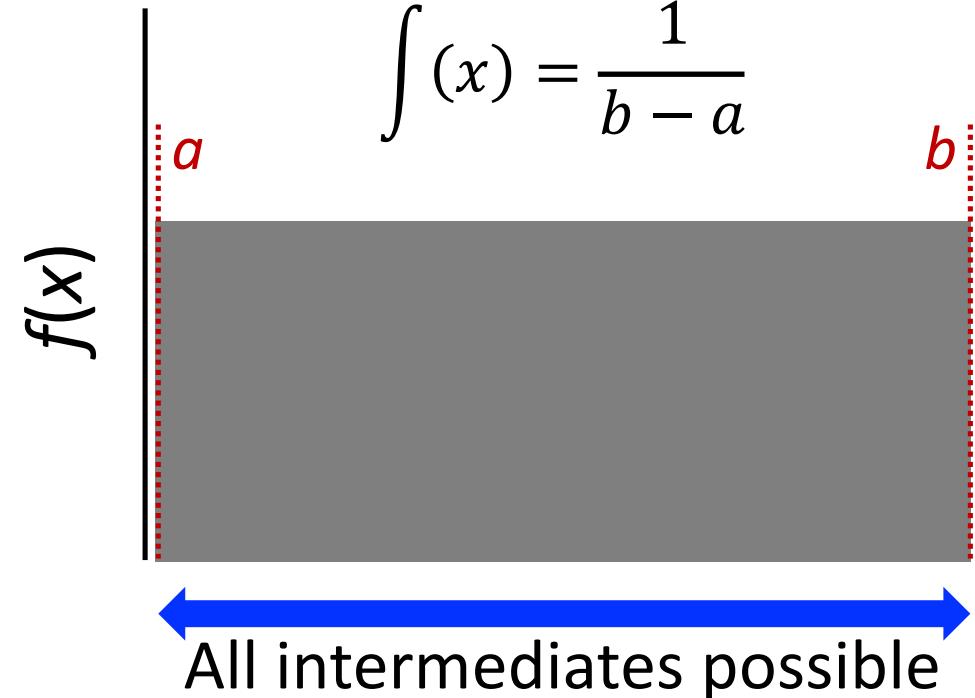
$$P(X = k) = \frac{1}{n}$$



## Continuous

(e.g., continuous uniform)

$$\int(x) = \frac{1}{b - a}$$

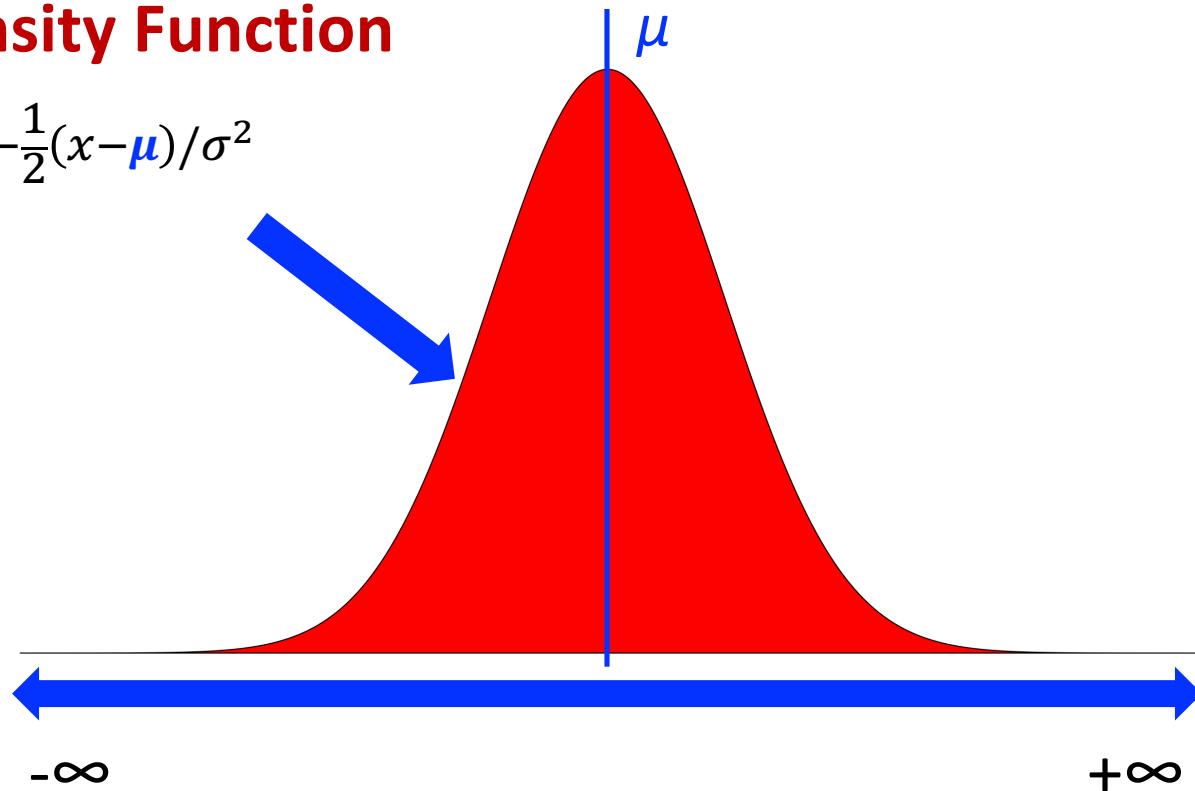




# Probability distributions: the normal

## Probability Density Function

$$f(x) = \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{1}{2}(x-\mu)/\sigma^2}$$

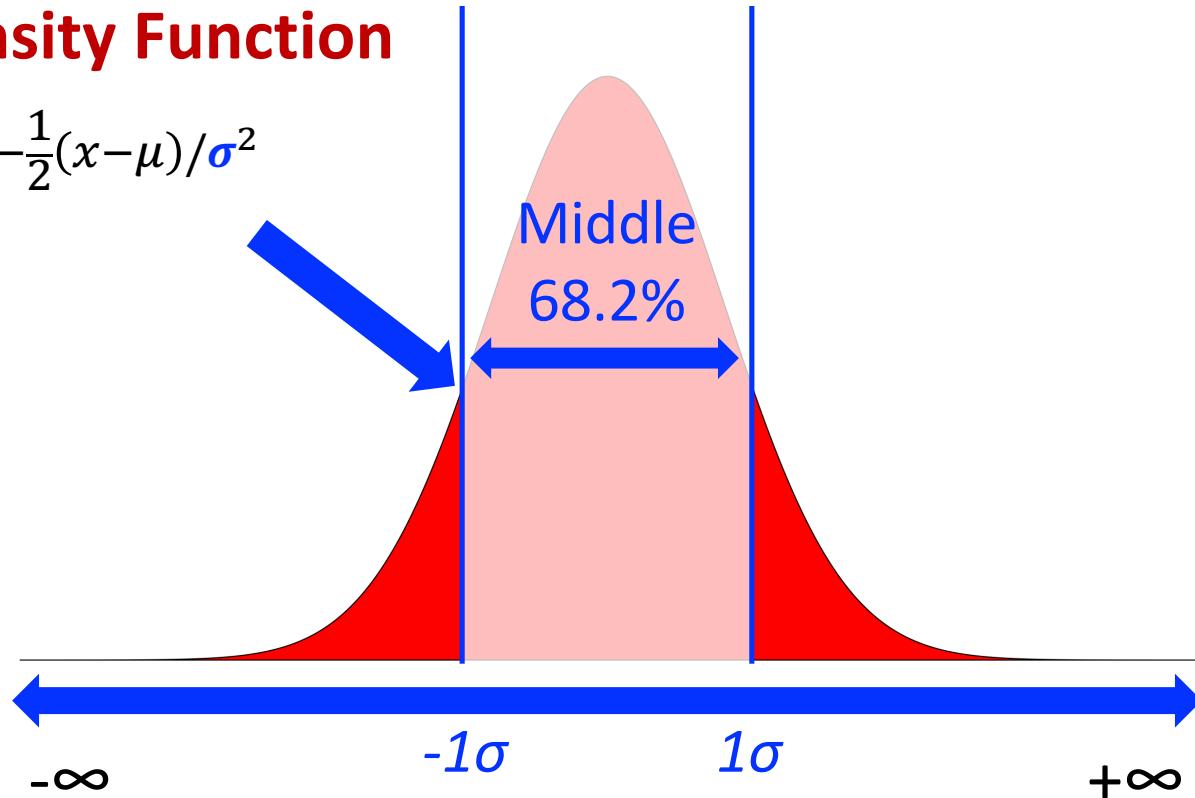




# Probability distributions: the normal

## Probability Density Function

$$f(x) = \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{1}{2}(x-\mu)/\sigma^2}$$

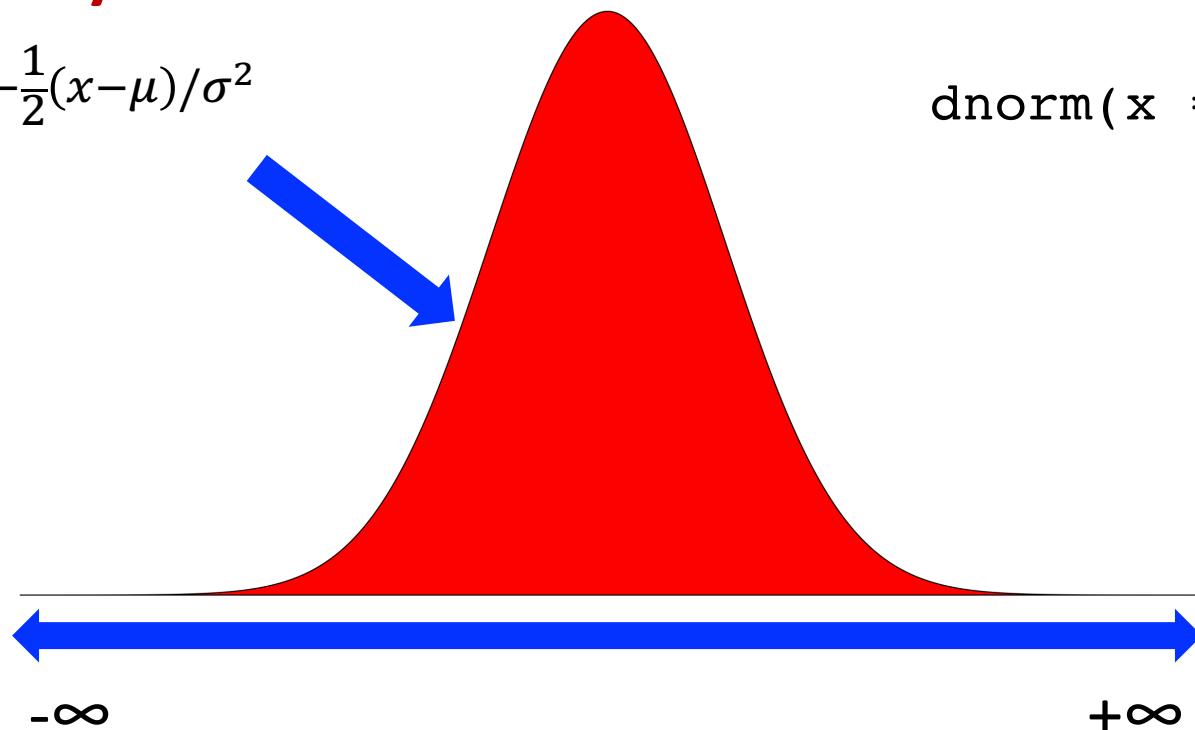




# Probability distributions: the normal

## Probability Density Function

$$f(x) = \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{1}{2}(x-\mu)/\sigma^2}$$



`dnorm(x = x, mean = mu,  
sd = sigma)`





# Goats!

