

Central Tendency, Modality, Skewness

Lecture 3
Emma Ning, M.A.

Last Week...



Samples vs. Populations



Levels of Measurement

(nominal, ordinal, interval, ratio)



Frequency Tables

(absolute vs. relative frequency)



Data Visualizations

(bar charts, pie charts, histograms, line graphs, box plots)

With last week's knowledge...

Imagine you are considering a job at a company.



A friend who works there says:

“The annual salaries here range from \$40K to \$2 million.”

How helpful is that? Do you feel like you understand what you might get paid? What about seeing a histogram?



Your other friend says:

“Most people here make around \$70K.”

That feels different, right? Why is that more useful?

TODAY'S PLAN

01

Shape & Modality

What words are typically
used to describe these?

03

Picking the Best Summary for the Data

Which one(s) from Section
01 and 02 should I use?

02

Central Tendency

Hey! We are glorifying the
meaning of “average”!

04

Wrap Up

Review + Reminders

Learning objectives

- Calculate and interpret the three measures of **central tendency** (mean, median, mode).
- Interpret the **modality** of a given distribution or graph (unimodal, bimodal, multimodal).
- Identify the **shape** (symmetrical, positively skewed, or negatively skewed) of a distribution.
- Explain how the three measures of central tendency — mean, median, and mode — are **related** to each other for symmetrical and skewed distributions.



Shape & Modality

Statistics

```
graph TD; Statistics --> DescriptiveStatistics[Descriptive Statistics]; Statistics --> InferentialStatistics[Inferential Statistics];
```

Descriptive Statistics

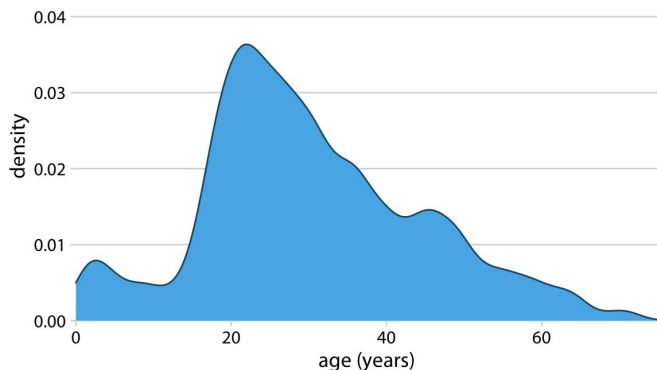
used to **summarize** and
describe data

Inferential Statistics

techniques used to **make**
generalizations about samples
and apply them to populations

Descriptive Statistics

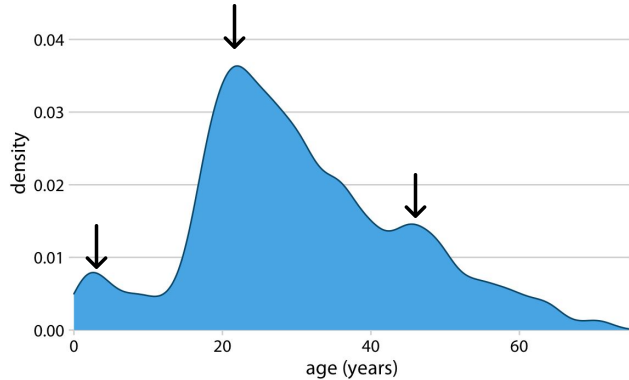
Remember this density plot from the last week?



Think of **descriptive statistics** this way:

How would you describe the overall shape of this data to a friend—without showing them a graph—and you're in a hurry?

Shape & Modality, in a nutshell



A **distribution** shows us how data are spread out—what values are common, and which ones are rare.

Imagine tossing a handful of sand onto the table—each grain is a data point. Where the sand piles up, you have more data; where it's sparse, fewer. That pattern is your distribution.

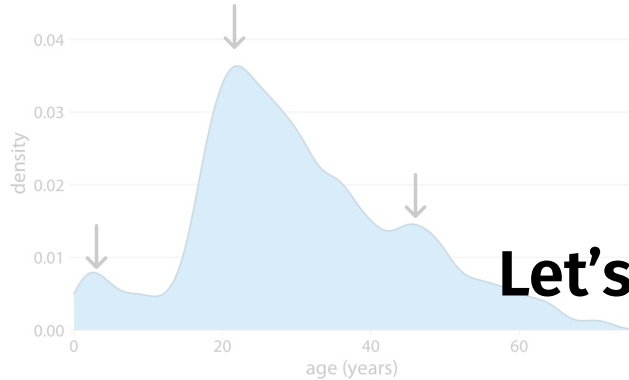
Shape & Modality refer to two aspects:

1. Is it symmetrical? → **symmetry/shape**
2. How many “peaks” does it have? → **modality**

Here, the distribution is not symmetrical, therefore it is **skewed**.

The distribution also seems to be **multimodal**.

Shape & Modality, in a nutshell



Let's see more examples!

Shape & Modality refer to two aspects:

1. Is it symmetrical? → **symmetry**
2. How many “peaks” does it have? → **modality**

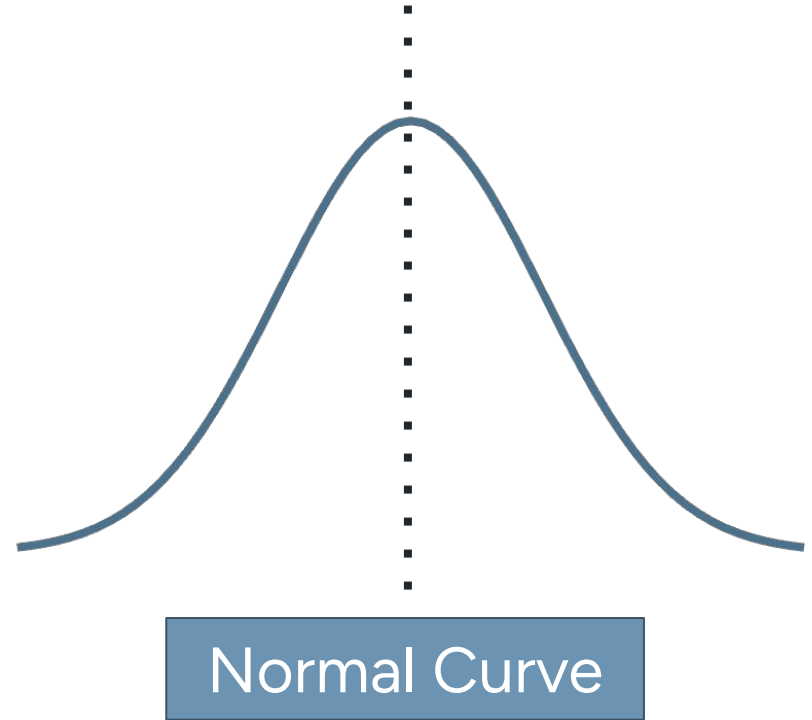
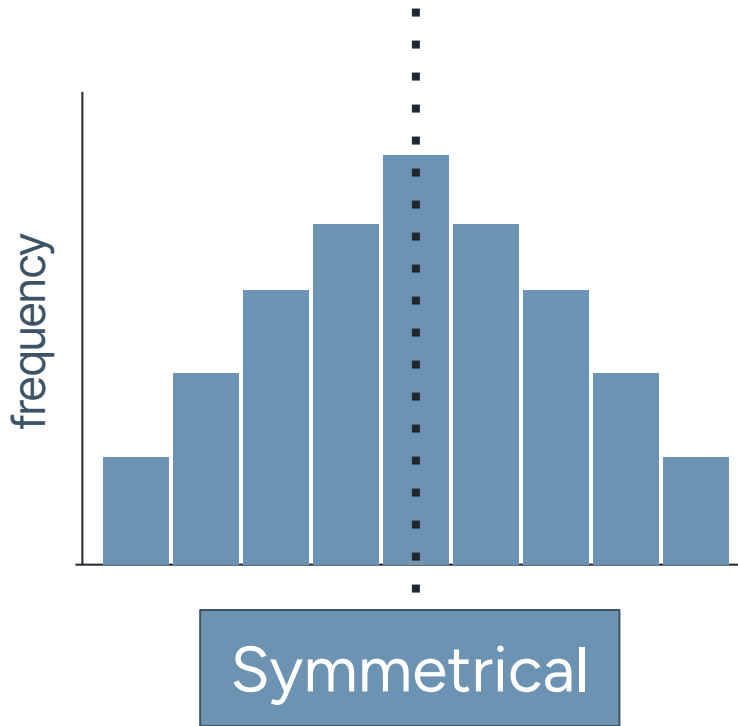
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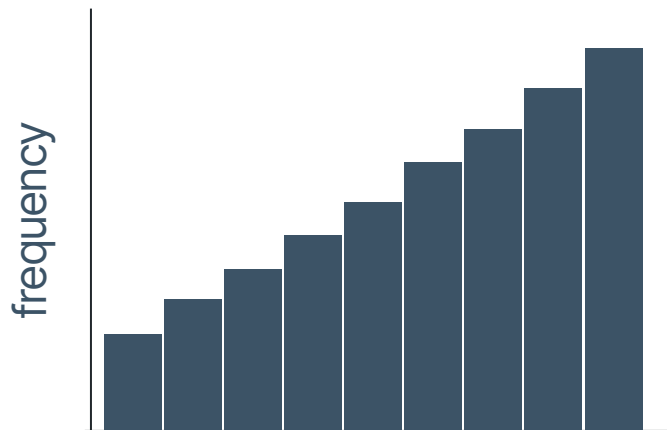
The distribution also seems to be **multimodal**.

First, Skewness (symmetry)



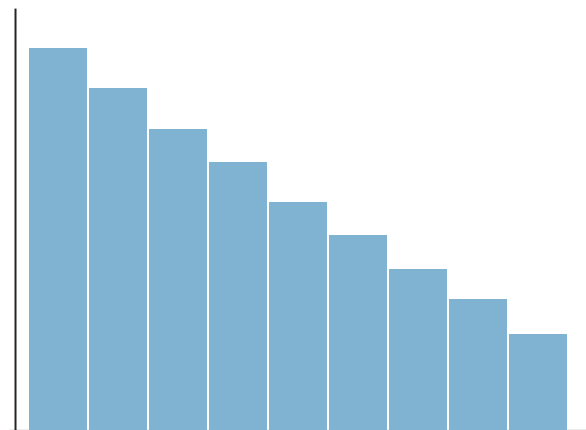
"they are **symmetrical/normal**"
(non-skewed is not wrong, but not what scientists say)

Skewness continued



**Negatively
Skewed**

"skewed to the **left**"

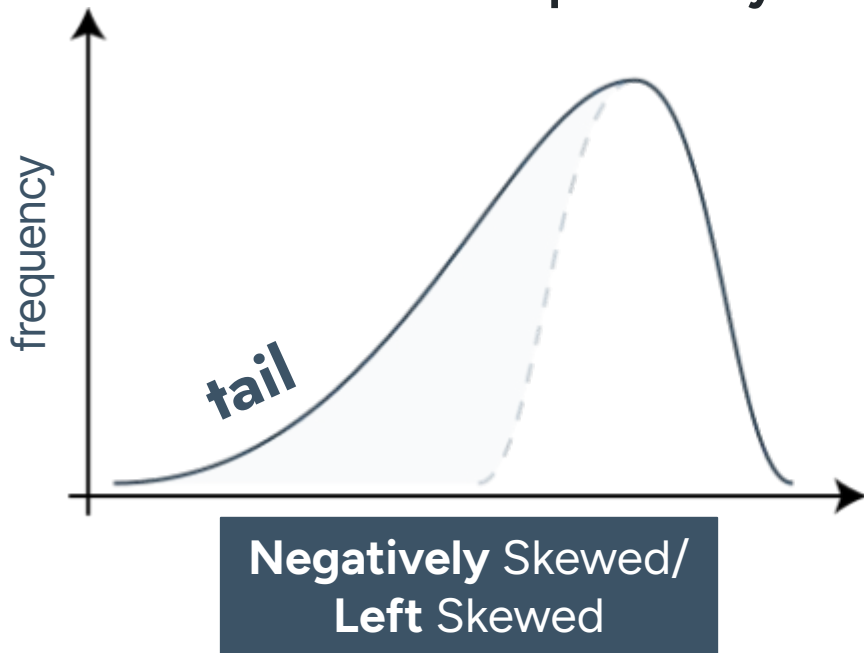


**Positively
Skewed**

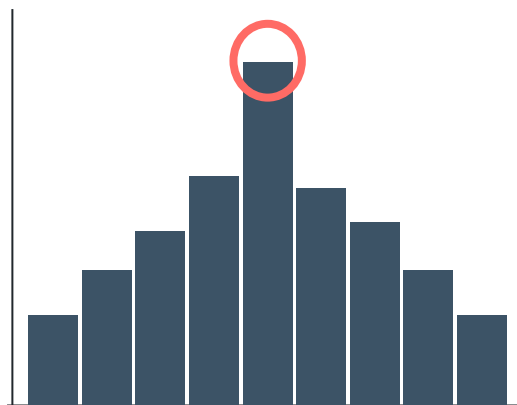
"skewed to the **right**"

TIP: FOLLOW THE TAIL!

A good way to remember which skewed distribution is which is to follow the tail. The tail of a **negatively skewed** distribution points **left**; the tail of the **positively skewed** distribution points **right**.

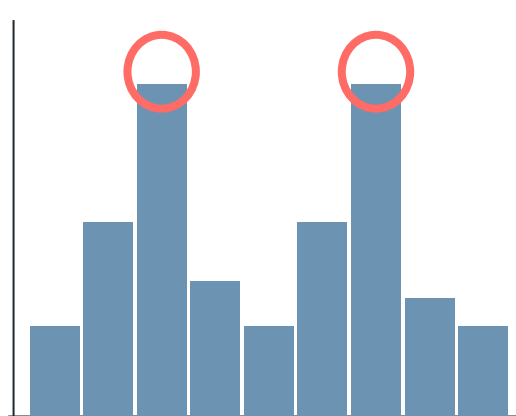


Next, Modality



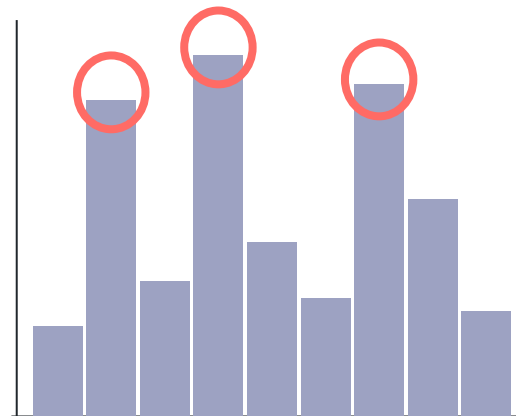
Unimodal

1 mode



Bimodal

2 modes



Multimodal

3+ modes

Note: Modality can be quite subjective in real data

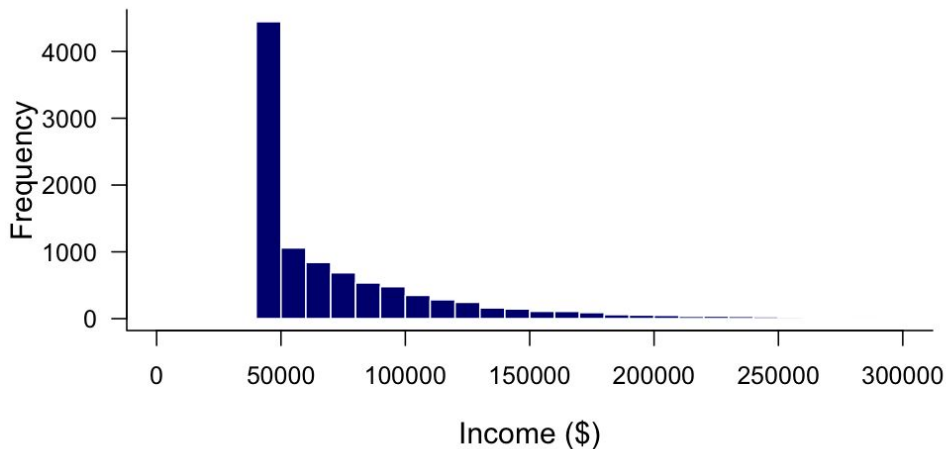
Let's go back to our first example



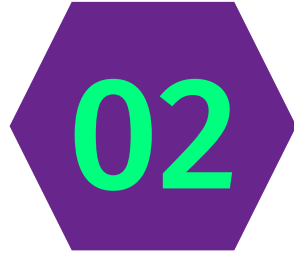
"The salaries here range from \$40K to \$2 million."



"Most people here make around \$70K."



The income distribution at this company is **unimodal, right-skewed** (aka **positively skewed**).



Central Tendency

3 Types of Central Tendency

1

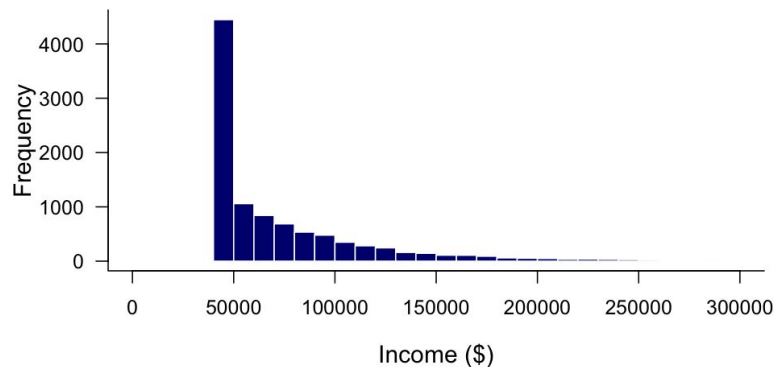
Mean

2

Median

3

Mode



Think of central tendency this way:
If you know the overall shape of a distribution—its bumps, peaks, or symmetry—how do you figure out where it balances on the x-axis? That balance point is the intuition behind central tendency.

The Mean

- The “**average**” of a set of scores
- A very commonly used measure of central tendency
- The mean requires at least **interval/ratio data** (you cannot compute it for either nominal or ordinal data).

μ
population
("mu")

M
(sample)

QUICK TIP

In statistics, **Greek letters** represent **population parameters**;
roman letters represent **sample statistics**.

$\boxed{A \alpha}$ alpha	$\boxed{B \beta}$ beta	$\Gamma \gamma$ gamma	$\Delta \delta$ delta	$E \varepsilon$ epsilon
$Z \zeta$ zeta	$\boxed{H \eta}$ eta	$\Theta \theta$ theta	$I \iota$ iota	$K \kappa$ kappa
$\Lambda \lambda$ lambda	$\boxed{M \mu}$ mu	$N \nu$ nu	$\Xi \xi$ xi	$O \omicron$ omikron
$\Pi \pi$ pi	$\boxed{P \rho}$ rho	$\boxed{\Sigma \sigma/\varsigma}$ sigma	$T \tau$ tau	$Y \upsilon$ upsilon
$\Phi \phi$ phi	$\boxed{X \chi}$ chi	$\Psi \psi$ psi	$\Omega \omega$ omega	

QUICK TIP

In statistics, **Greek letters** represent **population parameters**; **roman letters** represent **sample statistics**.

Meaning	Population	Sample
Mean	μ	M
Standard Deviation	σ	s or sd

Mean Formula *Conceptually*

$$M = \frac{\text{add up all scores}}{\text{number of scores}}$$

Unpacking the Mean Formula (sample)

$$M = \frac{\Sigma X}{n}$$

Σ is a **summation** symbol, which means we just **add up** all our scores (X)

n is our *sample size*

Unpacking the Mean Formula (population)

$$\mu = \frac{\sum X}{N}$$

Σ is a **summation** symbol, which means we just **add up** all our scores (X)

N is our *population* size

Quick Example

4

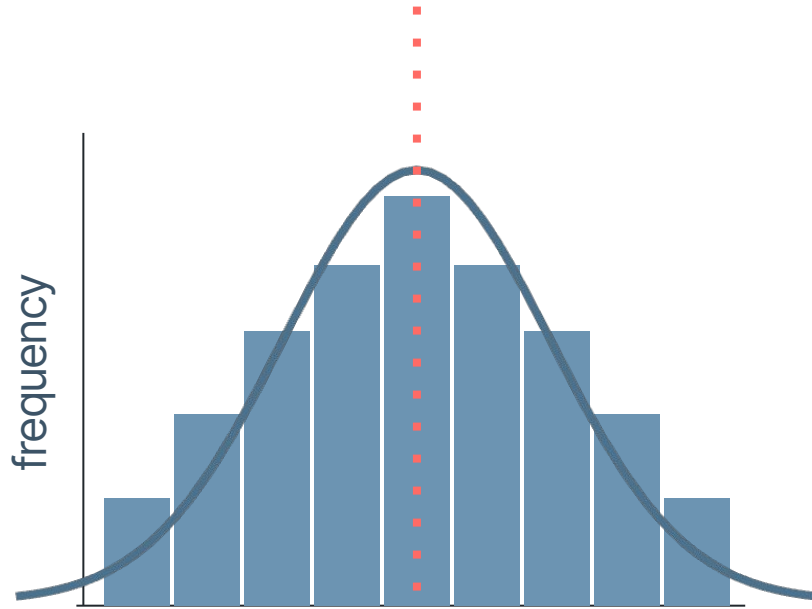
1

6

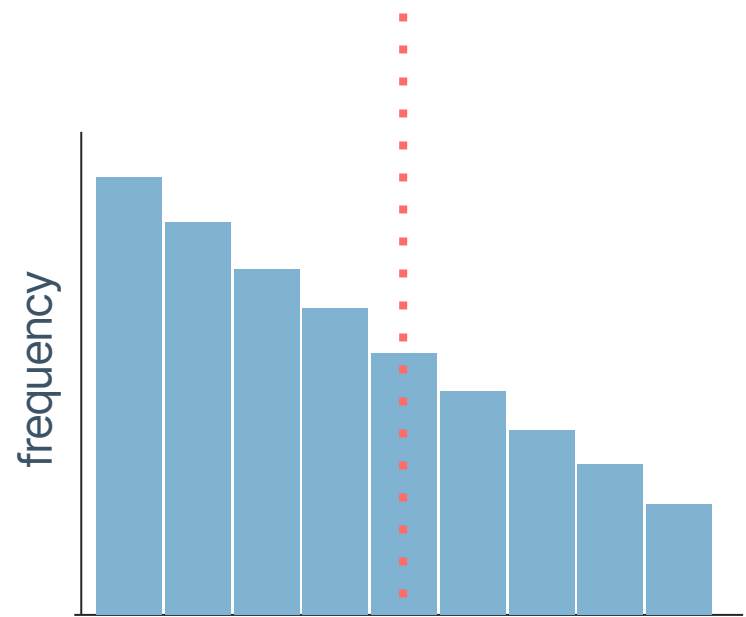
5

$$M = \frac{\sum x}{n} = \frac{4 + 1 + 6 + 5}{4} = 4$$

Mean - Imagining the “balancing point”



Normal
Curve



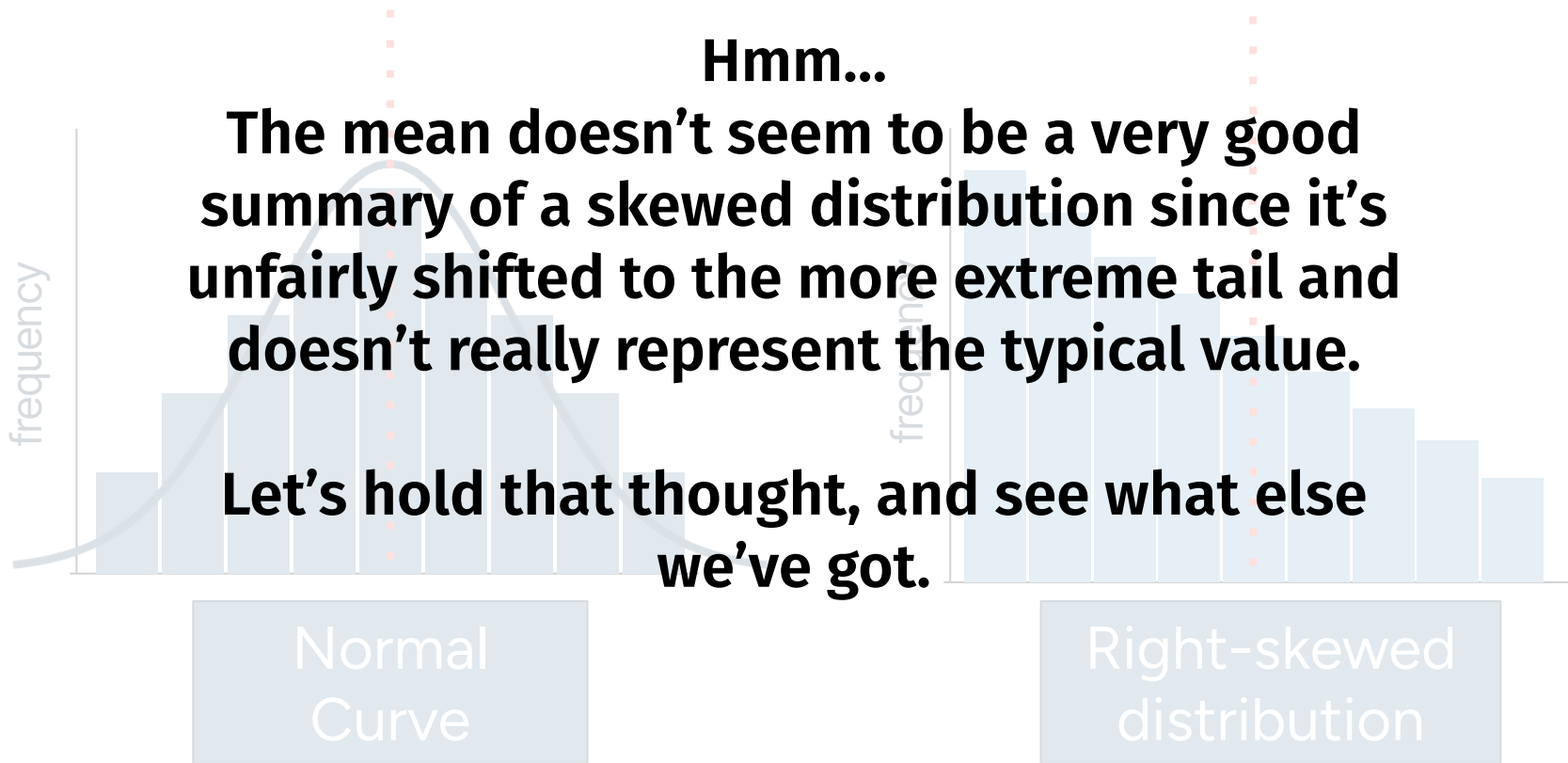
Right-skewed
distribution

Mean - Imagining the “balancing point”

Hmm...

The mean doesn't seem to be a very good summary of a skewed distribution since it's unfairly shifted to the more extreme tail and doesn't really represent the typical value.

Let's hold that thought, and see what else we've got.



The Median

- The score that **divides the amount of data exactly in half** – that is, half of the scores are below the median and half are above the median.
- It is the precise midpoint (also referred to as the **50th percentile**).
- The median requires **at least ordinal data** (you cannot compute it for nominal data).



Mdn

Median Calculation

The computation of the median depends on whether there are an **odd** number or **even** number of observations (N).

ODD

6, 7, 1, 2, 5, 8, 8



Rank it 1, 2, 5, 6, 7, 8, 8

Find the middle number
~~1, 2, 5,~~ 6, ~~7, 8, 8~~

EVEN

1, 3, 7, 4, 6, 1



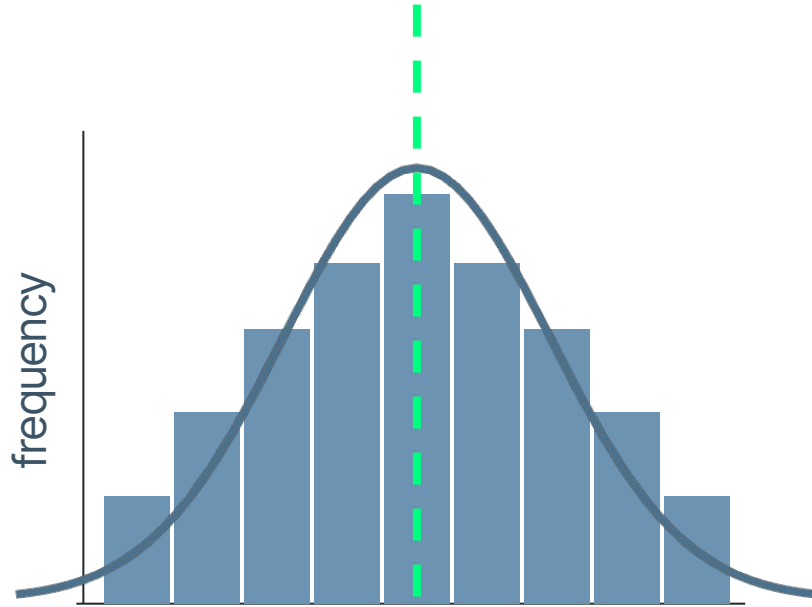
1, 1, 3, 4, 6, 7

~~1, 1,~~ 3, 4, ~~6, 7~~

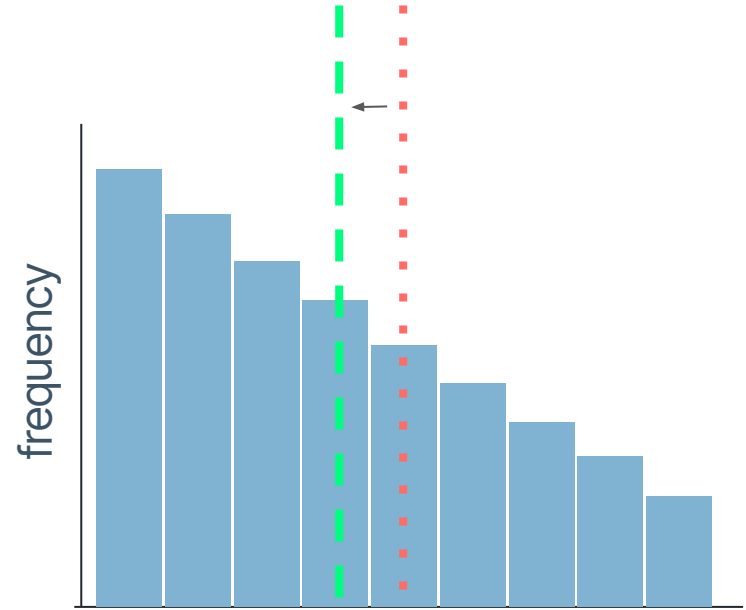
3.5

(average of two middle numbers)

Median - A different "balancing point"



Normal
Curve



Right-skewed
distribution

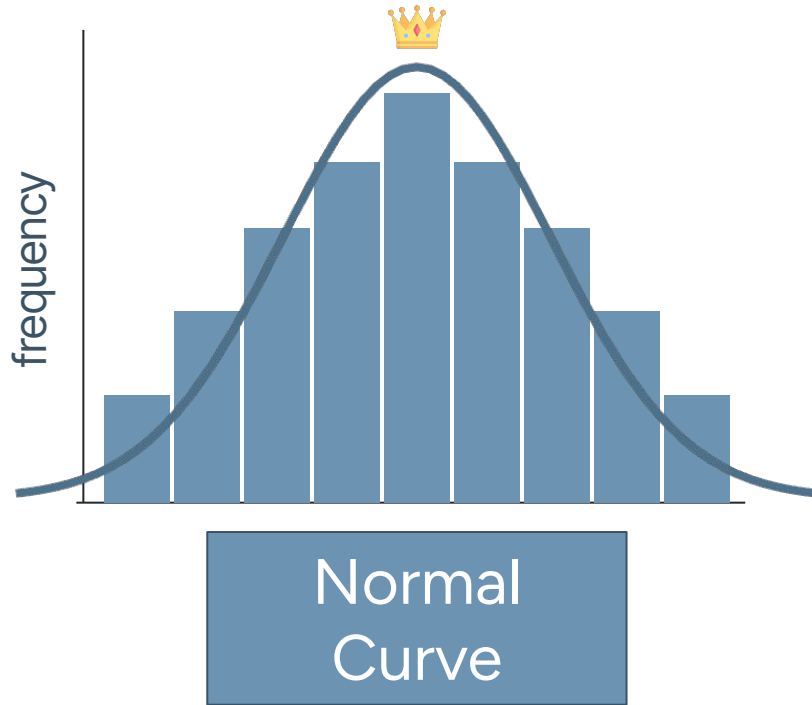
The Mode

- The mode is the **most frequent score** in the data/distribution.
- It is the "typical" value.
- The mode only requires nominal data, but you can also compute it for ordinal, interval, and ratio (**any** type of data)

1, 3, 4, 5, 7, 7, 7, 9, 10, 10

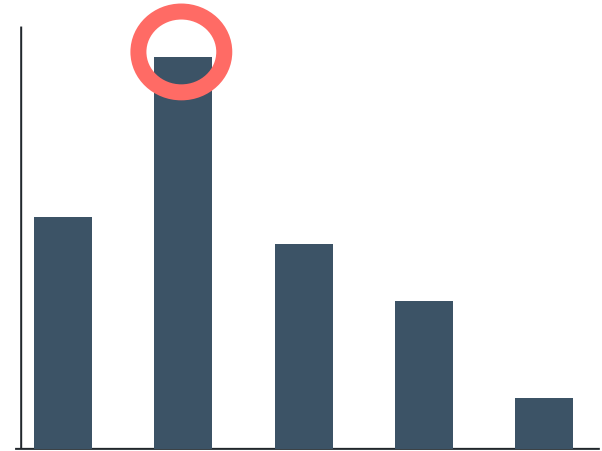
1, 3, 4, 5, 7, 7, 7, 9, 10, 10

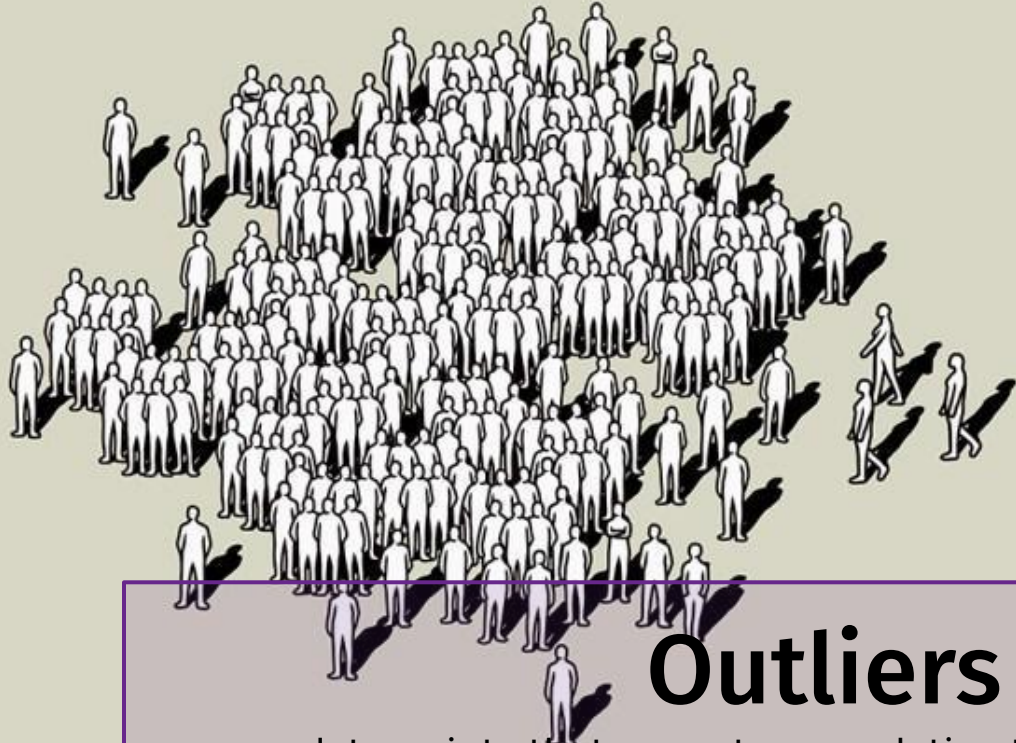
Mode - The populist



The mode can be easily spotted with a **frequency table** or **bar graph/histogram**.

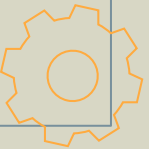
Diagnosis	F	P
ADHD	9	22.5%
Major Depression	15	37.5%
PTSD	8	20%
Generalized Anxiety	6	15%
Schizophrenia	2	5%
N	40	100%





Outliers

are data points that are extreme relative to others in a dataset



TRUE or FALSE?

1

The mean is the most commonly used measure of central tendency in psychological statistics.

2

The median can be determined for ordinal data as well as interval and ratio data.

3

For nominal/categorical data, the only measure of central tendency we can use is the mode.

4

Greek letters are often used for sample data, whereas Roman letters are often used for populations.

TRUE or FALSE?

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The mean is the most commonly used measure of central tendency in psychological statistics.



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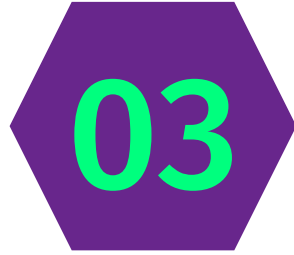


Example Descriptive Statistics Table

Table 1
Participant Characteristics

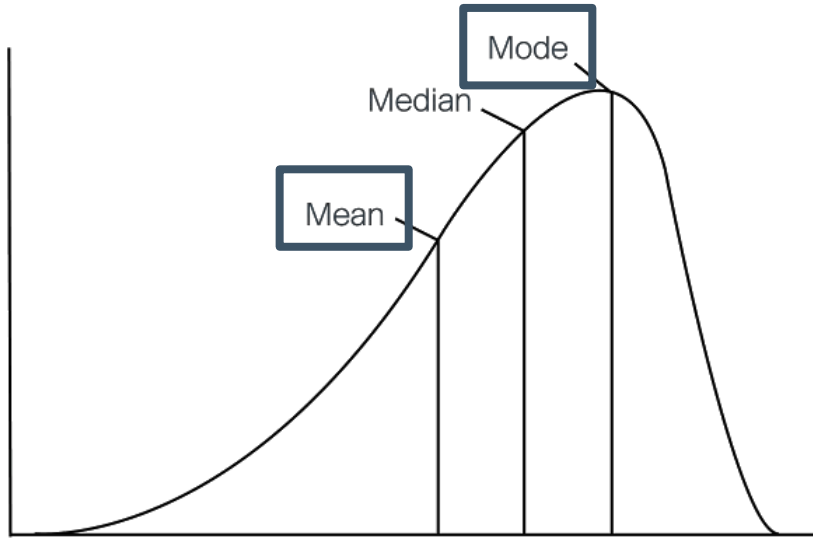
Variable	Total sample	ACE group	
		Low	High
<i>N</i>	211	143	68
Age: <i>M</i> (<i>SD</i>)	44.09 (17.14)	45.03 (17.62)	42.12 (16.03)
Education: <i>M</i> (<i>SD</i>)	13.82 (2.96)	13.84 (3.09)	13.79 (2.69)
Sex: <i>n</i> (%)			
Male	112 (53.1%)	79 (55.2%)	33 (48.5%)
Female	99 (46.9%)	64 (44.8%)	35 (51.5%)

"The sample had a **mean age** of **44.09 years** ($SD = 17.14$) and education of **13.82 years** ($SD = 2.96$; range: 6–20). Sex distribution was **53.1% male** ($n = 112$) and **46.9% female** ($n = 99$)."



Picking the Best Summary for the Data

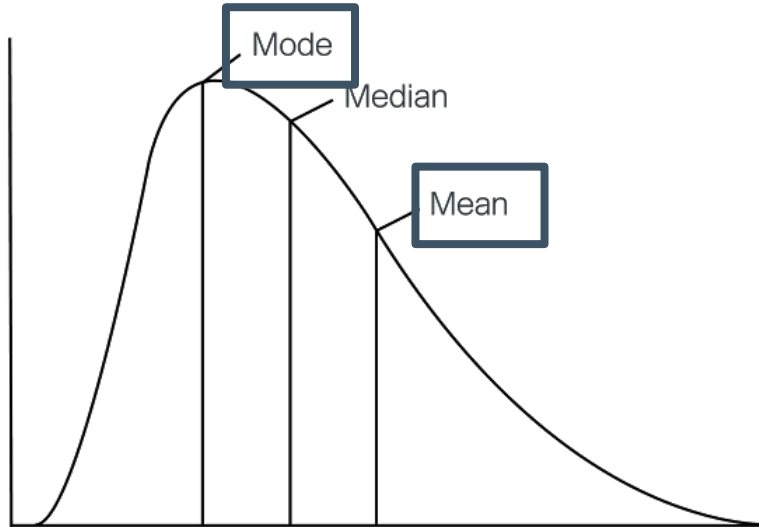
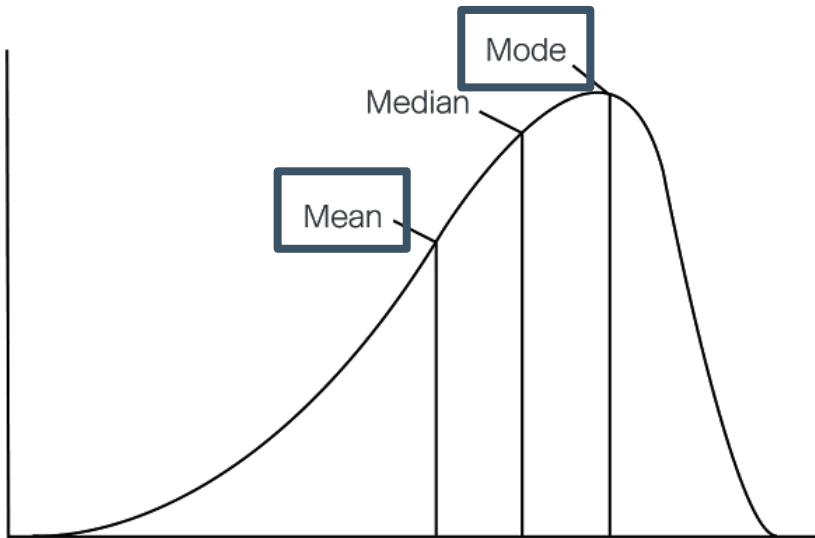
Skewed distributions can affect our measures of central tendency.



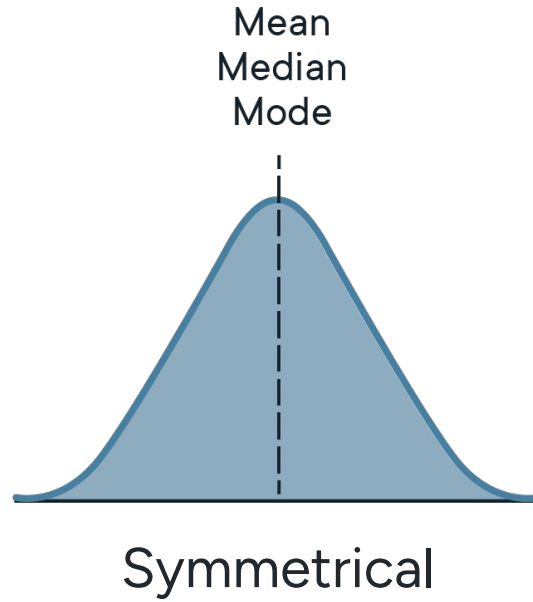
The **mode** will always be at the very top (most common), as it is **unaffected by outliers**.

The **mean** will always “follow” the tail, as the **mean is the most affected by outliers**.

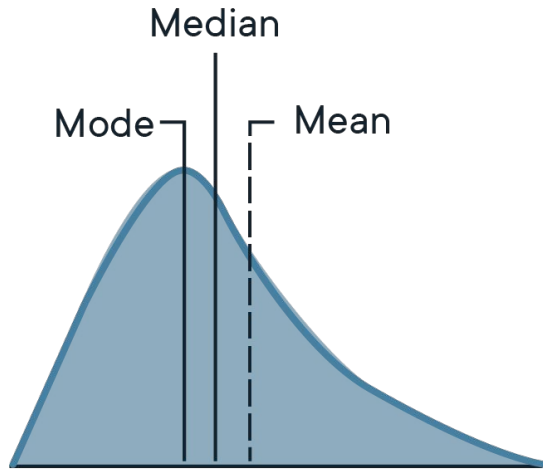
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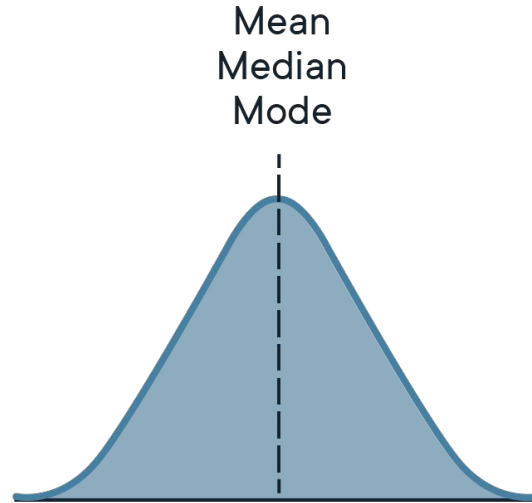
Summary



Summary

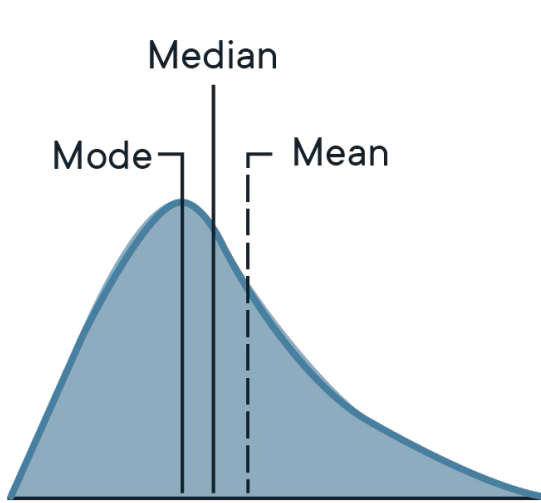


Positive Skew

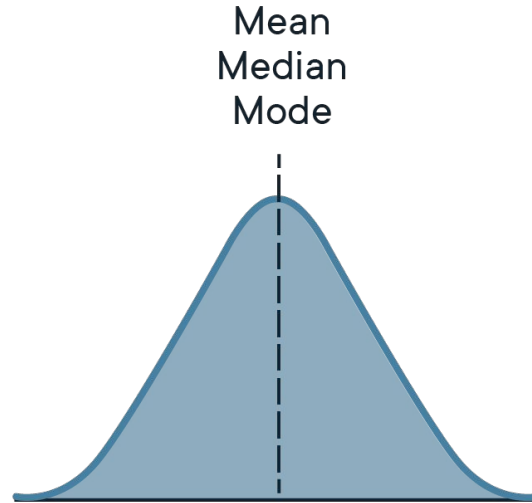


Symmetrical

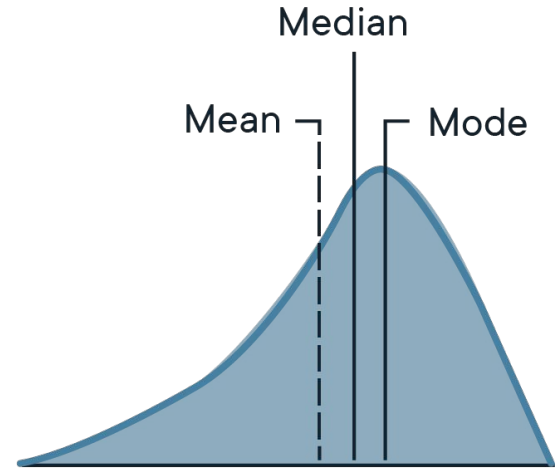
Summary



Positive Skew



Symmetrical



Negative Skew

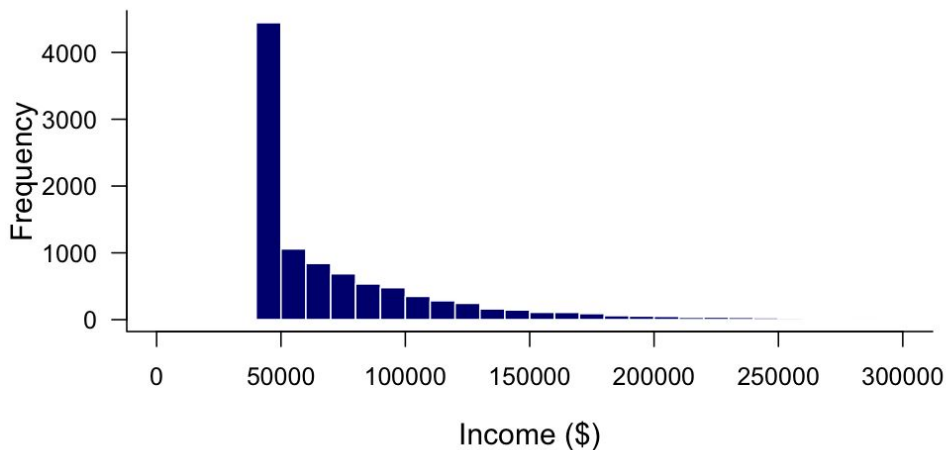
First example, again



“The salaries here range from \$40K to \$2 million.”



“Most people here make around \$70K.”



What is the best measure of central tendency for this distribution if you are the job applicant?

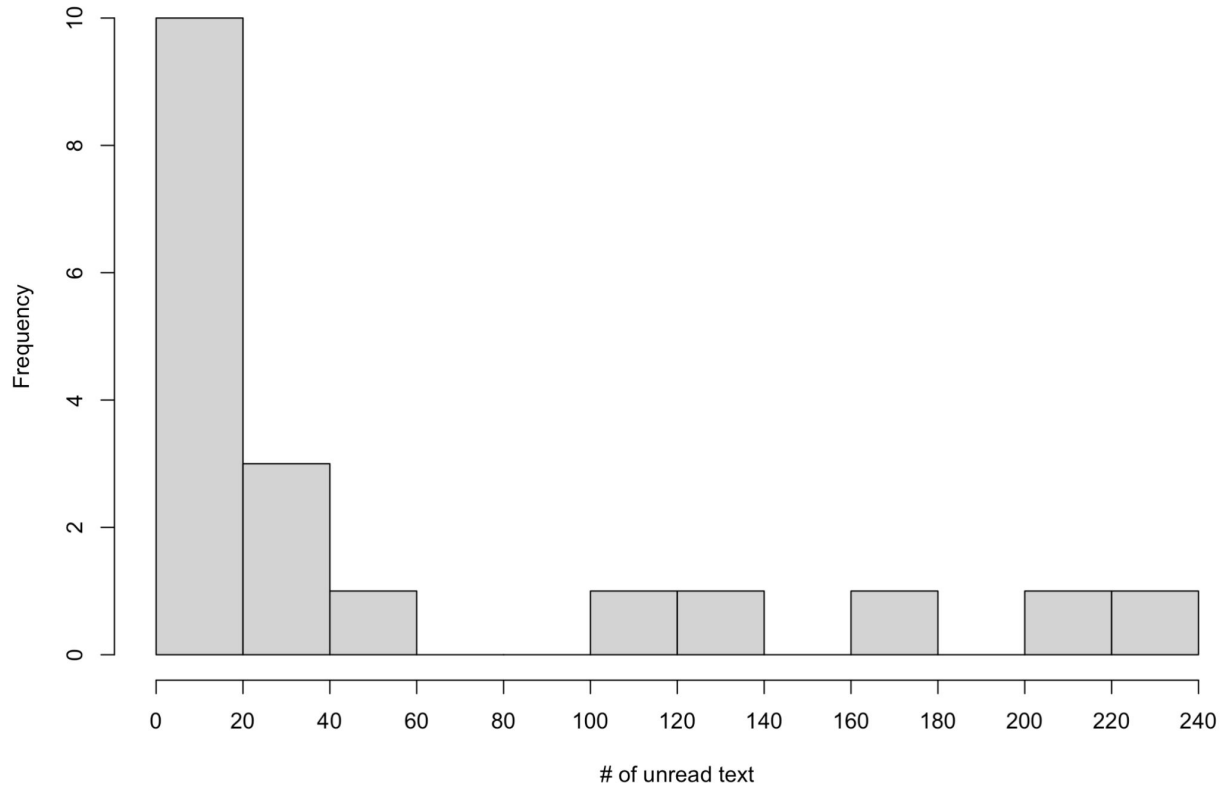
What is the best measure of central tendency for the employers to put in the job ad?

ICA 3

You will be given a small dataset about your classmates. Work with your group to do the following:

1. Calculate the **mean**, **median**, and **mode**.
2. Create a **histogram**. **Label** the x and y axes.
3. Describe the **shape** and/or **modality** of your distribution.

of unread texts, from our class



M = 54.42

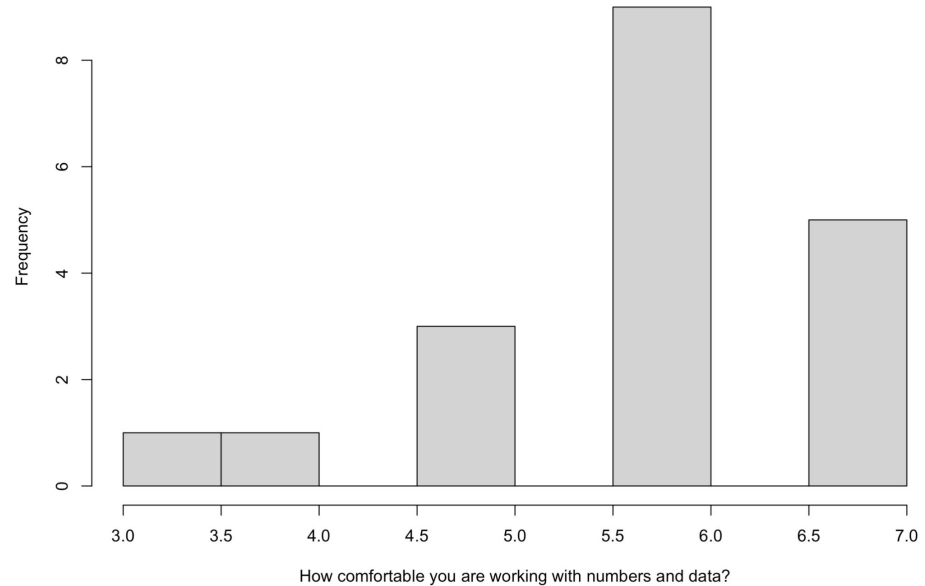
Mdn = 17

Mode = 1

Unimodal, very
right-skewed

I am comfortable working with numbers and data.

- 1 ☐ Strongly agree
- 2 ☐ Agree
- 3 ☐ Slightly agree
- 4 ☐ Neither agree nor disagree
- 5 ☐ Slightly disagree
- 6 ☐ Disagree
- 7 ☐ Strongly disagree




Seeing the modality and shape of this distribution, what does this tell me about how I should design my class? Should I worry about math anxiety too much?



Wrap Up



How does this relates to our last class?

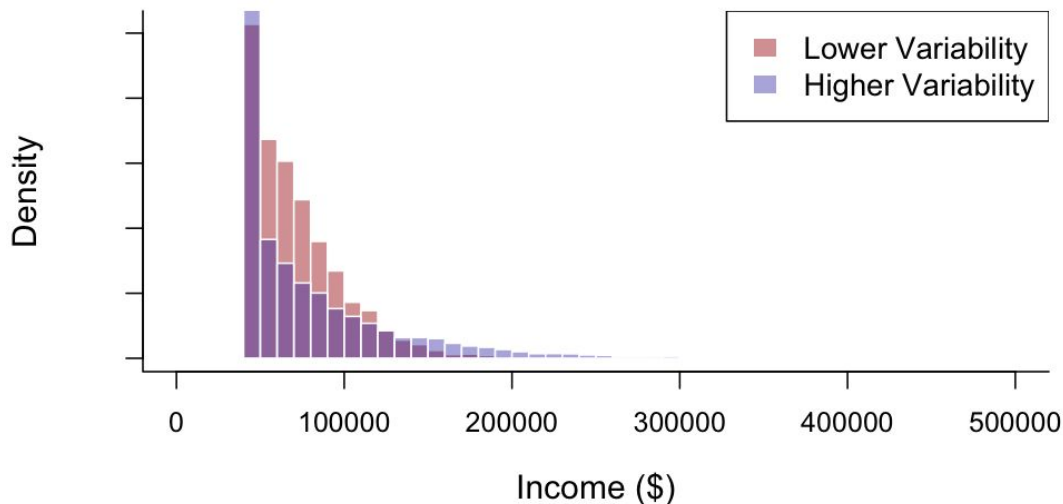
		Nominal	Ordinal	Interval	Ratio
					
What You Can/Cannot Do	Count	✓	✓	✓	✓
	Order	✗	✓	✓	✓
	Add; Subtract	✗	✗	✓	✓
	Multiply; Divide; Average	✗	✗	✗	✓

Which of the things from today can you calculate?

		Nominal	Ordinal	Interval	Ratio
What You Can/Cannot Do	Mode	✓	✓	✓	✓
	Median; Percentile	✗	✓	✓	✓
	Mean	✗	✗	✓	✓
	Everything above + ratios	✗	✗	✗	✓
	Modality of distribution	✓	✓	✓	✓

Being a job applicant again

You are choosing between 2 companies: A  or B 



You don't know your contract yet, which offer are you leaning toward?