

**USING ALL OF THESE
YOU CAN STUDY ANY
PHENOMENA AND
DRAW INFERENCES
ABOUT THEM**

RANDOM VARIABLES

PROBABILITY DISTRIBUTIONS

SAMPLING

HYPOTHESIS TESTING

SAMPLING IS A LITTLE BIT LIKE FISHING

SAMPLING IS A LITTLE BIT LIKE FISHING

YOU ARE A MARINE BIOLOGIST
YOU LEARN ABOUT FISH

HOW?



SAMPLING IS A LITTLE BIT LIKE FISHING

YOU ARE A MARINE BIOLOGIST
YOU LEARN ABOUT FISH
HOW?

YOU DO THIS BY

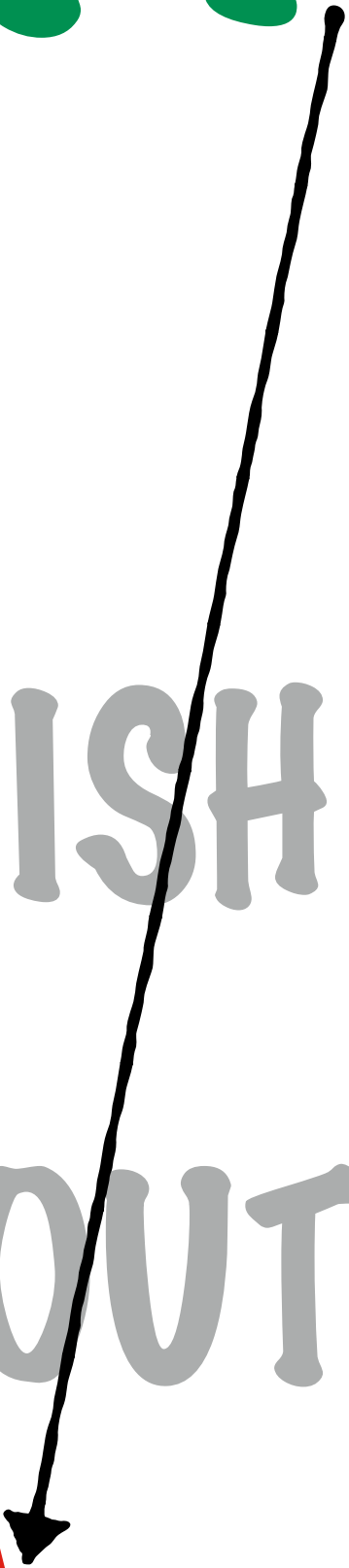
- 1. CATCHING SOME FISH**
- 2. STUDYING THE CAUGHT FISH**
- 3. DRAW CONCLUSIONS ABOUT
ALL THE FISH IN THE SEA**

SAMPLING IS A LITTLE BIT LIKE FISHING

YOU ARE A MARINE BIOLOGIST
YOU LEARN ABOUT FISH
HOW?

POPULATION

YOU DO THIS BY

1. CATCHING SOME FISH
 2. STUDYING THE CAUGHT FISH
 3. DRAW CONCLUSIONS ABOUT
ALL THE FISH IN THE SEA
- 

SAMPLING IS A LITTLE BIT LIKE FISHING

YOU ARE A MARINE BIOLOGIST
YOU LEARN ABOUT FISH
HOW?

SAMPLE

YOU DO THIS BY

1. CATCHING **SOME FISH**
2. STUDYING THE CAUGHT FISH
3. DRAW CONCLUSIONS ABOUT
ALL THE FISH IN THE SEA
POPULATION

SAMPLING IS A LITTLE BIT LIKE FISHING

YOU ARE A MARINE BIOLOGIST
YOU LEARN ABOUT FISH
HOW?

SAMPLING

YOU DO THIS BY

1. CATCHING SOME FISH
(SAMPLE)

2. STUDYING THE CAUGHT FISH

3. DRAW CONCLUSIONS ABOUT
ALL THE FISH IN THE SEA
POPULATION

**DRAWING CONCLUSIONS
ABOUT THE POPULATION
BY OBSERVING THE
SAMPLE IS CALLED
GENERALIZATION**

**DRAWING CONCLUSIONS
ABOUT THE POPULATION
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DRAWING CONCLUSIONS
ABOUT THE POPULATION
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GENERALIZATION

INFERENCES

DRAWING **CONCLUSIONS**
ABOUT THE POPULATION
BY OBSERVING THE
SAMPLE IS CALLED

GENERALIZATION

PSYCHOLOGICAL STUDIES

POLLING

DRUG TRIALS

A/B TESTS

MARKET RESEARCH SURVEYS

PSYCHOLOGICAL STUDIES
POLLING
DRUG TRIALS
A/B TESTS
MARKET RESEARCH SURVEYS

THESE ARE JUST **A FEW**
EXAMPLES OF WHERE SAMPLING
MIGHT BE USED

GIVEN ANY SAMPLE

THE SAMPLE CAN BE DESCRIBED
USING SAMPLE STATISTICS

THESE ARE NUMBERS THAT
CHARACTERIZE THE SAMPLE

SAMPLE STATISTICS

DEPENDING ON THE TYPE OF VARIABLE YOU ARE
MEASURING, YOU MIGHT BE INTERESTED IN

SAMPLE MEAN

OR

SAMPLE PERCENTAGE

SAMPLE STATISTICS

SAMPLE MEAN USED WHEN THE VARIABLE IS CONTINUOUS

HEIGHTS OF A GROUP OF PEOPLE	USER ENGAGEMENT ON A WEBSITE
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SAMPLE PERCENTAGE

SAMPLE STATISTICS

SAMPLE MEAN USED WHEN THE VARIABLE IS CONTINUOUS

SAMPLE PERCENTAGE NORMALLY USED WHEN THE
VARIABLE IS BINARY (YES/NO)

DO YOU SUPPORT
THIS CANDIDATE?

IS THIS DRUG AN
EFFECTIVE TREATMENT?

SAMPLE STATISTICS

SAMPLE MEAN / SAMPLE PERCENTAGE

THE NEXT IMPORTANT STATISTIC TO
KNOW IS THE STANDARD DEVIATION
OF THE SAMPLE

SAMPLE STATISTICS

SAMPLE MEAN / SAMPLE PERCENTAGE

THE STANDARD DEVIATION OF THE SAMPLE

THIS IS DIFFERENT FOR MEAN VS %
MEASUREMENTS

SAMPLE STATISTICS

SAMPLE MEAN / SAMPLE PERCENTAGE

THE STANDARD DEVIATION OF THE SAMPLE

IF WE ARE INTERESTED IN SAMPLE MEAN

$$SD = \sqrt{\frac{\sum (x - \bar{x})^2}{n}}$$

THIS IS **STRAIGHTFORWARD**,
THE USUAL FORMULA

SAMPLE STATISTICS

SAMPLE MEAN / SAMPLE PERCENTAGE

THE STANDARD DEVIATION OF THE SAMPLE

IF WE ARE INTERESTED IN SAMPLE %

$$\text{s.d. } (p) = \sqrt{\frac{p(1-p)}{n}}$$

P IS THE % OF YESES

LET'S IMAGINE YOU PICKED
100 DIFFERENT SAMPLES

WITH **EACH** YOU COMPUTED
THE SAMPLE MEAN/%

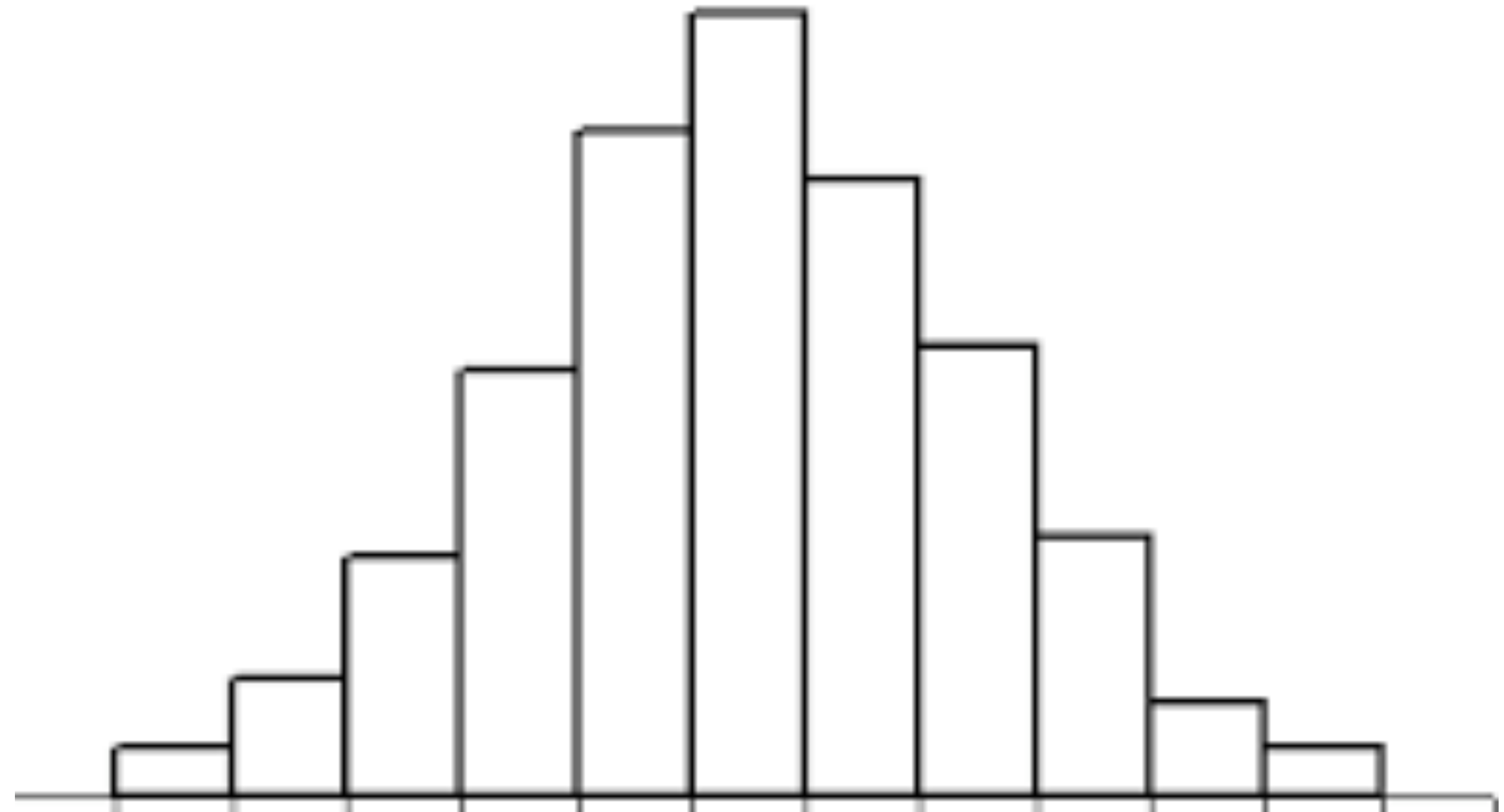
SAMPLE 1	53%
SAMPLE 2	55%
SAMPLE 3	54%
.....
SAMPLE 100	49%

SAMPLE 1	53%
SAMPLE 2	55%
SAMPLE 3	54%
.....
SAMPLE 100	49%

THESE VALUES REPRESENT A
VALUES OF RANDOM VARIABLE

IF YOU PLOT **THE HISTOGRAM**
OF THESE VALUES, THAT WILL
REPRESENT IT'S **PROBABILITY**
DISTRIBUTION

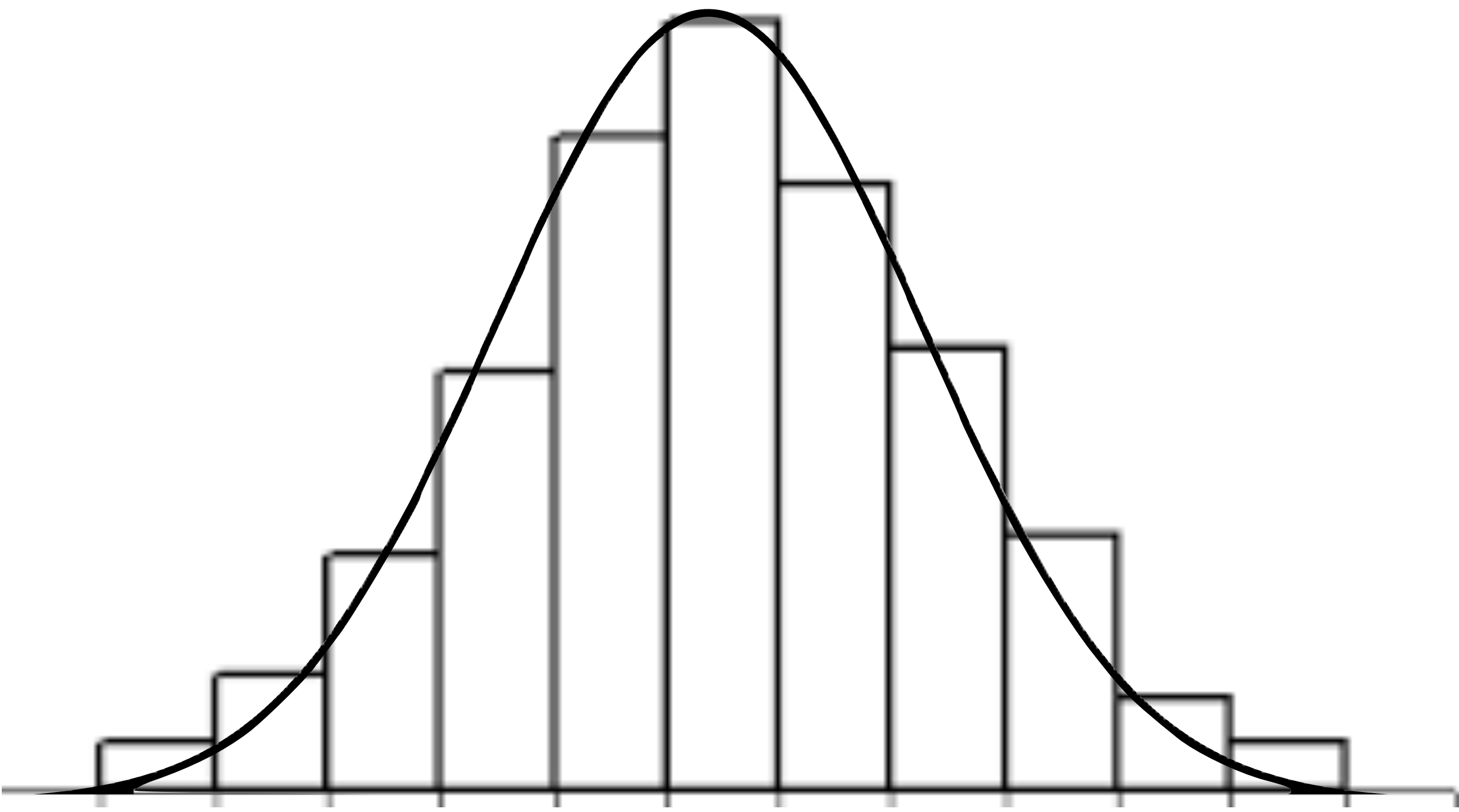
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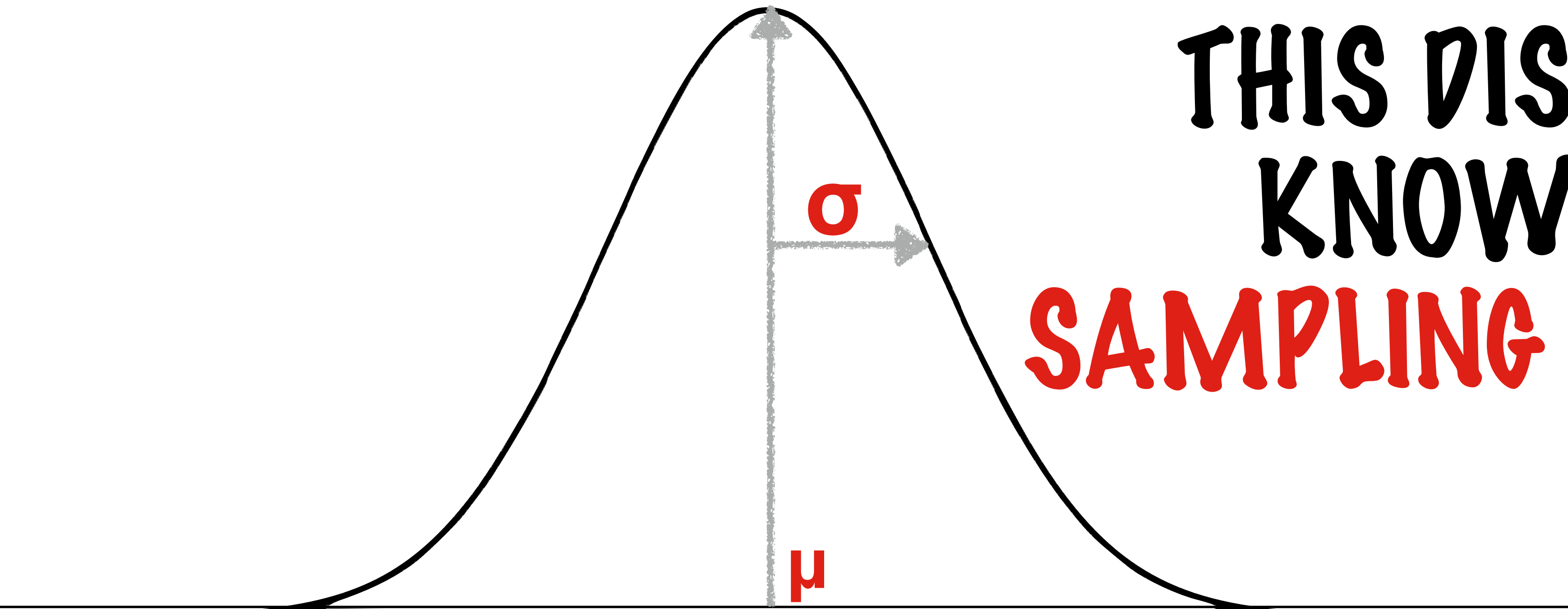
HOW OFF IS THE % OF THE SAMPLE FROM THE % OF THE POPULATION?

SAMPLE 1	53%
SAMPLE 2	55%
SAMPLE 3	54%
.....
SAMPLE 100	49%

IT TURNS OUT, WHENEVER YOU TAKE A **LARGE NUMBER OF SAMPLES**, THE **% (OR MEANS)** OF THOSE SAMPLES FOLLOW A **NORMAL DISTRIBUTION**

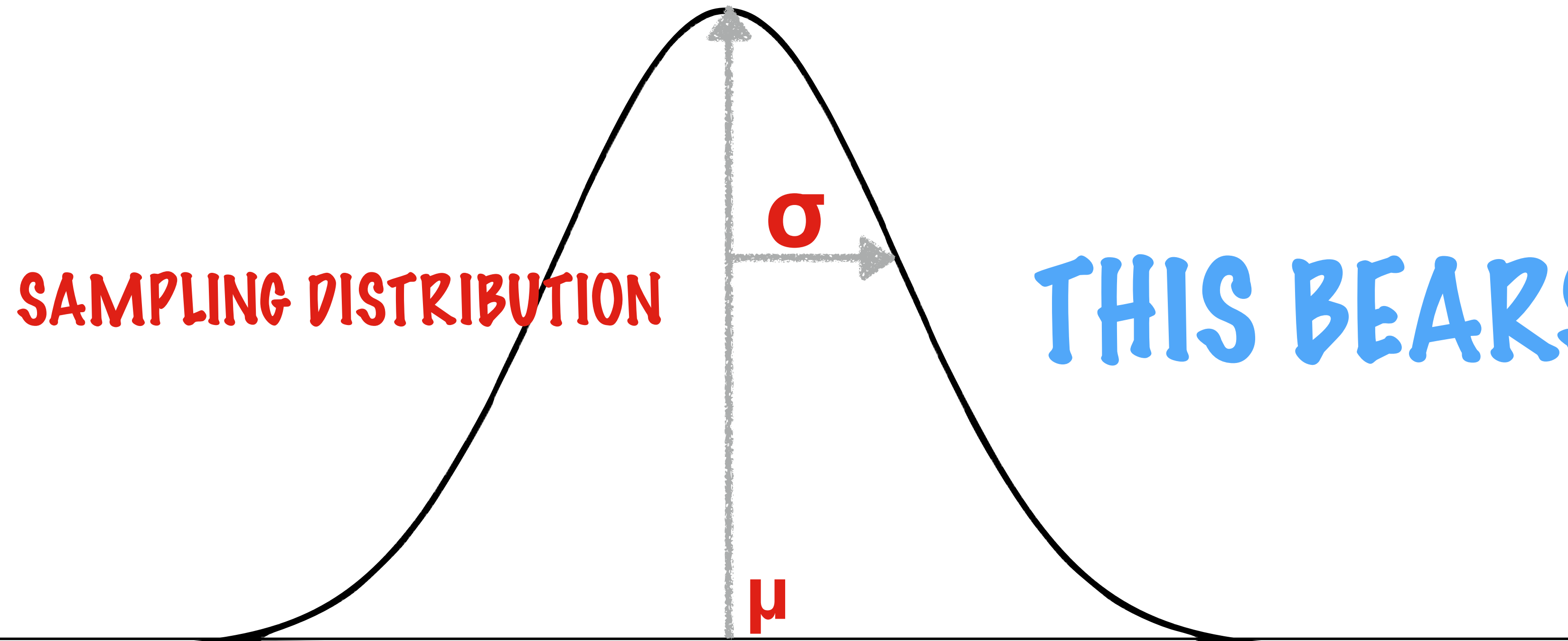


HOW OFF IS THE % OF THE SAMPLE
FROM THE % OF THE POPULATION?



THIS DISTRIBUTION
KNOWN AS THE
SAMPLING DISTRIBUTION

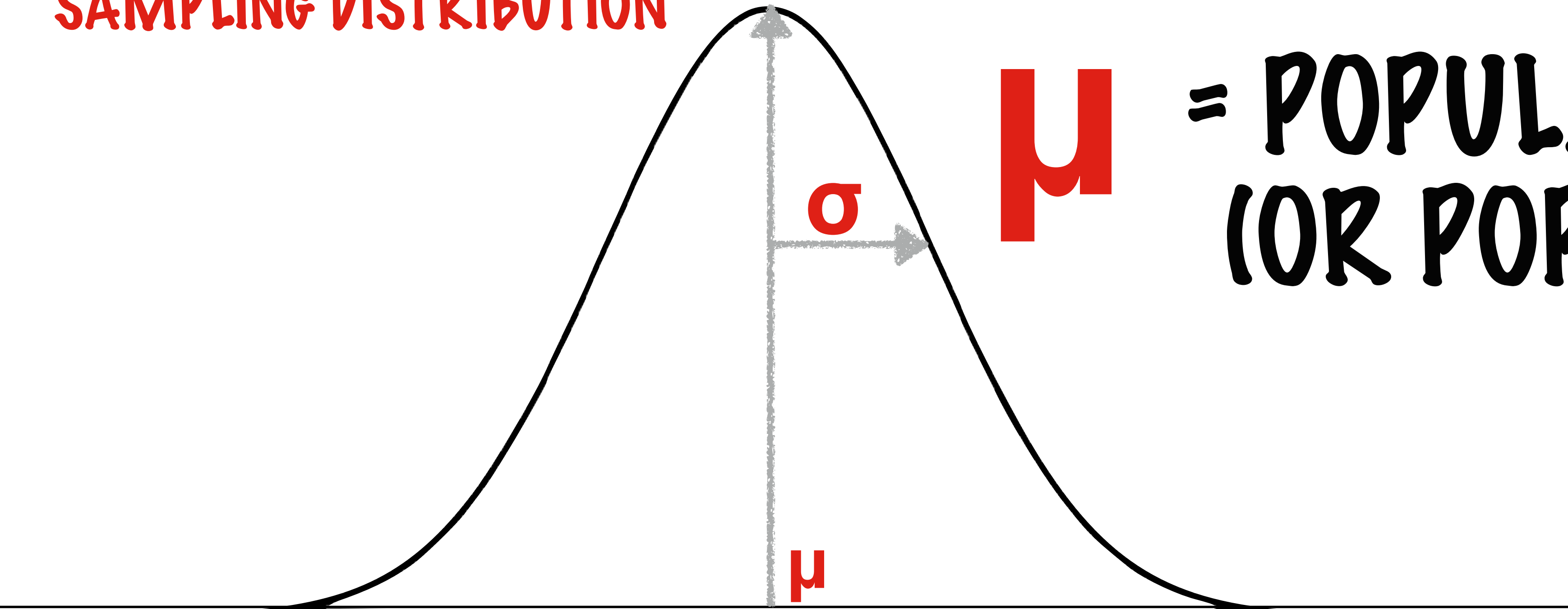
HOW OFF IS THE % OF THE SAMPLE
FROM THE % OF THE POPULATION?



THIS BEARS REPEATING

THE **SAMPLING DISTRIBUTION** OF A % (OR MEAN) IS THE
DISTRIBUTION YOU GET WHEN YOU COMPUTE THAT
VALUE FOR A **LARGE NUMBER OF SAMPLES**

SAMPLING DISTRIBUTION



**μ = POPULATION MEAN
(OR POPULATION %)**

**THE MEAN VALUE OF THIS DISTRIBUTION =
THE VALUE FOR THE POPULATION**

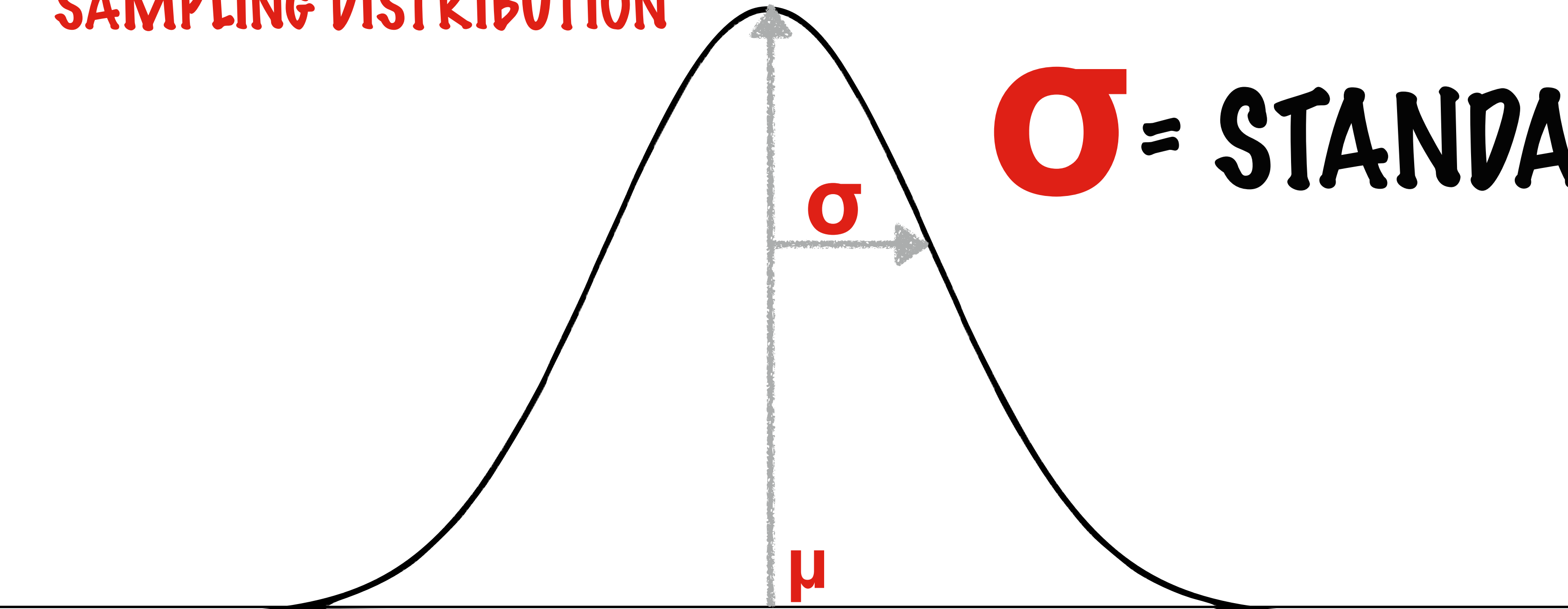
SAMPLING DISTRIBUTION

the best estimate of the **mean** of the **sampling distribution** is simply - **the sample average!**

\bar{X}

THE MEAN VALUE OF THIS DISTRIBUTION =
THE VALUE FOR THE POPULATION

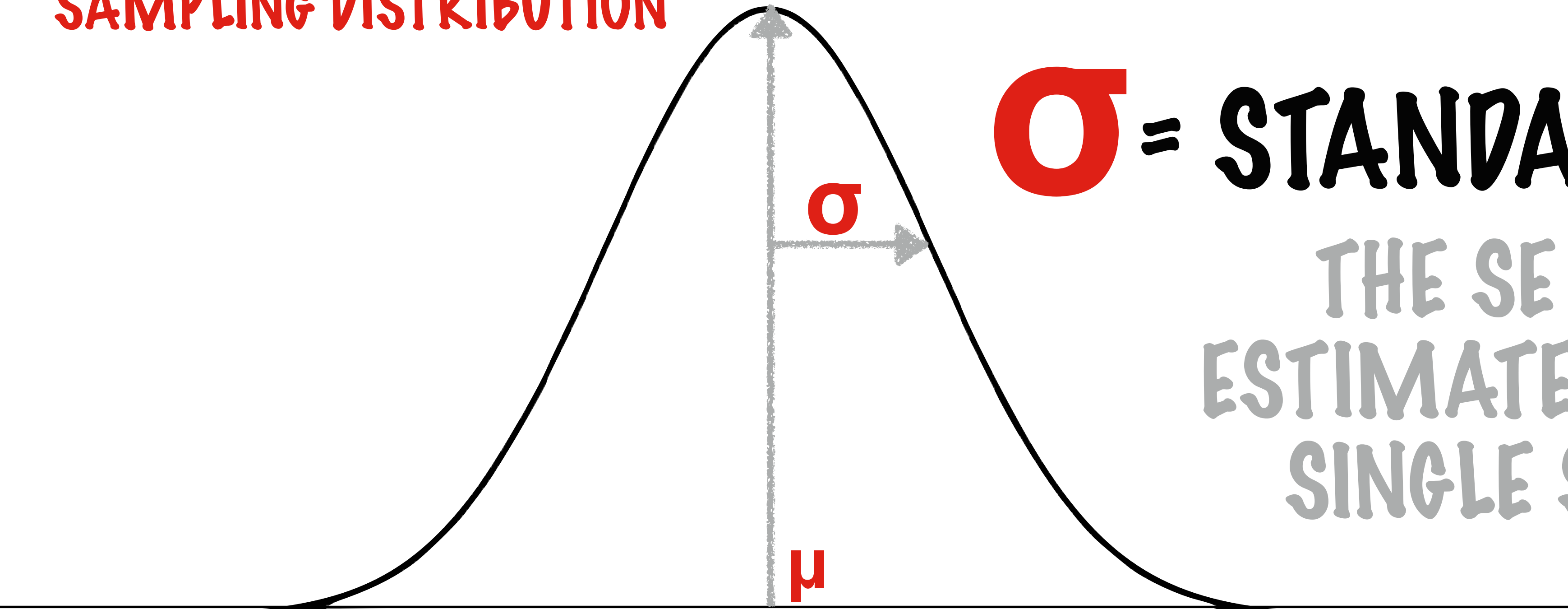
SAMPLING DISTRIBUTION



σ = STANDARD ERROR

THE **SE** CAN BE ESTIMATED FROM A
SINGLE SAMPLE

SAMPLING DISTRIBUTION



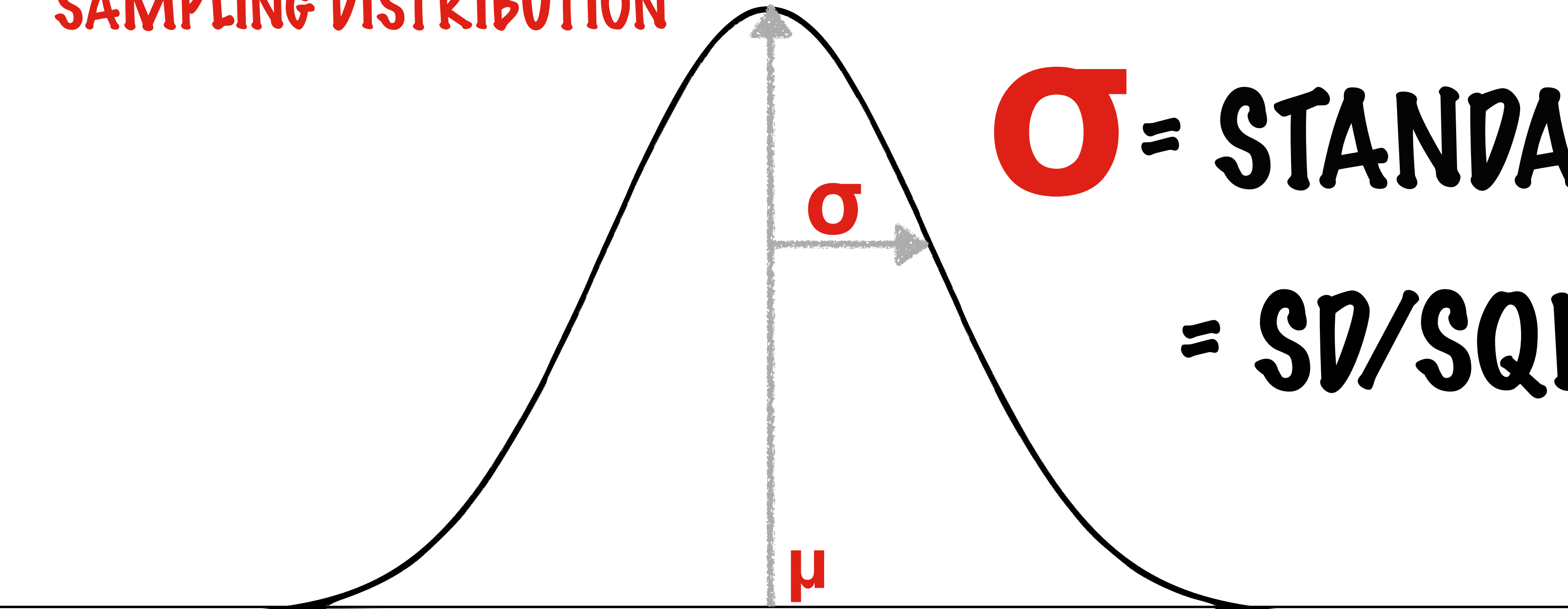
σ = STANDARD ERROR

THE SE CAN BE
ESTIMATED FROM A
SINGLE SAMPLE

IT DEPENDS ON THE **SD** AND
THE **SIZE OF THE SAMPLE**

IF WE ARE INTERESTED IN **SAMPLE MEAN**

SAMPLING DISTRIBUTION

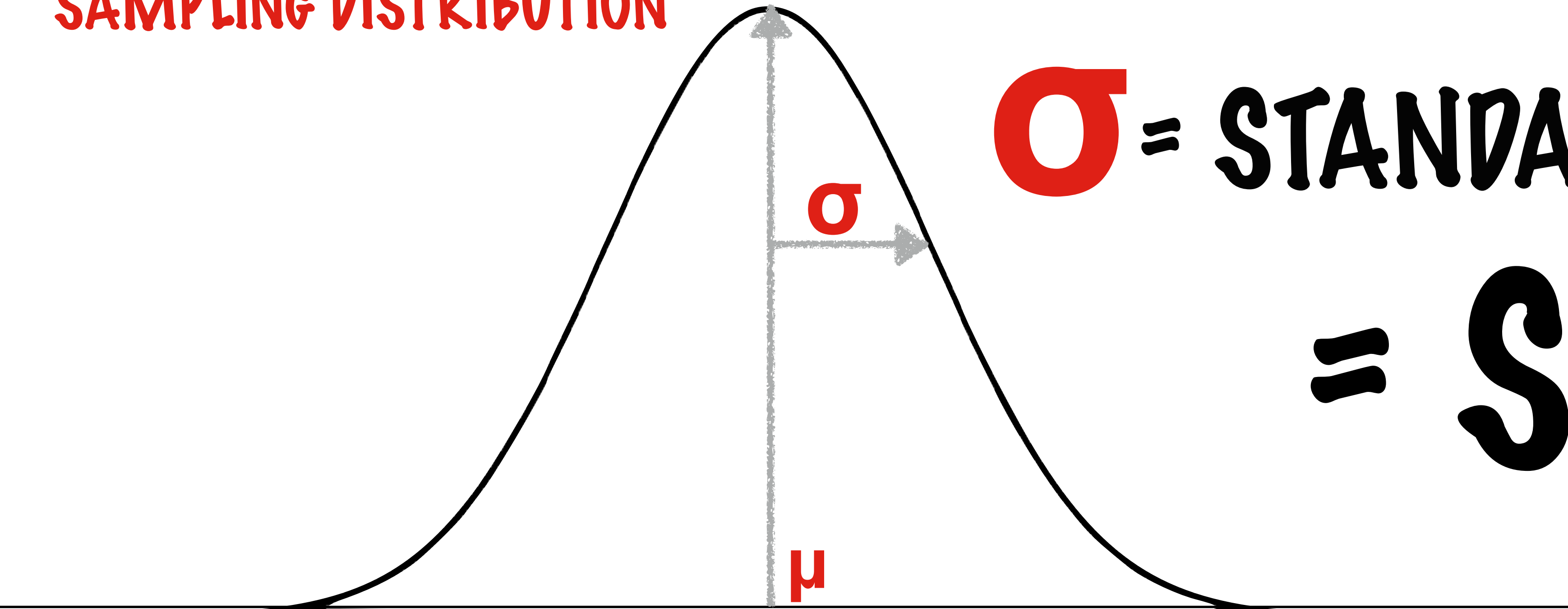


σ = STANDARD ERROR
= SD/SQRT(N)

IT DEPENDS ON THE **SD** AND
THE **SIZE OF THE SAMPLE**

IF WE ARE INTERESTED IN **SAMPLE %**

SAMPLING DISTRIBUTION



σ = STANDARD ERROR
= SD

IT DEPENDS ON THE **SD** AND
THE **SIZE OF THE SAMPLE**

SAMPLE STATISTICS

SAMPLE MEAN / SAMPLE PERCENTAGE

THE STANDARD DEVIATION OF THE SAMPLE

STANDARD ERROR

ONCE YOU HAVE THESE 3 NUMBERS,
THEY BECOME THE MEANS FOR
DRAWING INFERENCES ABOUT THE
POPULATIONS

**DRAWING INFERENCES ABOUT THE
POPULATIONS**

**MOST INFERENCES
FALL UNDER FEW
SPECIFIC TYPES**

DRAWING INFERENCES ABOUT THE
POPULATIONS

THERE IS A STANDARD
PROCEDURE INVOLVED
FOR EACH TYPE

DRAWING INFERENCES ABOUT THE POPULATIONS

TO DRAW ANY INFERENCE

1. IDENTIFY THE TYPE

2. FOLLOW THE STANDARD PROCEDURE

TYPES OF INFERENCES

1. IDENTIFYING THE POPULATION MEAN

“Airline pilots are on average
5’5” tall
+/- 1” ”

TYPES OF INFERENCES

2. IDENTIFYING THE POPULATION %

“ 40%

+/- 1%

of youngsters in cities like Sci-fi ”

TYPES OF INFERENCES

3. VERIFYING WHETHER THE POPULATION MEAN IS EQUAL TO A CERTAIN VALUE

“ The average life expectancy of college graduates is 70 years ”

TYPES OF INFERENCES

4. VERIFYING WHETHER THE POPULATION
% IS EQUAL TO A CERTAIN VALUE

“ 30% of people who took the drug
had a side effect”

TYPES OF INFERENCES

5. VERIFYING WHETHER 2 POPULATION MEANS ARE DIFFERENT

“Indians are on average shorter
than Americans”

TYPES OF INFERENCES

6. VERIFYING WHETHER 2 POPULATION % ARE DIFFERENT

“ Only 10% of people who don't take the drug get better,
but 80% of people who take the drug get better”

TYPES OF INFERENCES

1. IDENTIFYING THE POPULATION MEAN

2. IDENTIFYING THE POPULATION %

3. VERIFYING WHETHER THE POPULATION MEAN IS EQUAL TO A CERTAIN VALUE

4. VERIFYING WHETHER THE POPULATION % IS EQUAL TO A CERTAIN VALUE

5. VERIFYING WHETHER 2 POPULATION MEANS ARE DIFFERENT

6. VERIFYING WHETHER 2 POPULATION % ARE DIFFERENT

TYPES OF INFERENCES

1. IDENTIFYING THE POPULATION MEAN
2. IDENTIFYING THE POPULATION %
3. VERIFYING WHETHER THE POPULATION MEAN IS EQUAL TO A CERTAIN VALUE
4. VERIFYING WHETHER THE POPULATION % IS EQUAL TO A CERTAIN VALUE
5. VERIFYING WHETHER 2 POPULATION MEANS ARE DIFFERENT
6. VERIFYING WHETHER 2 POPULATION % ARE DIFFERENT

LET'S TAKE SOME CASE STUDIES AND GO
THROUGH THE STANDARD PROCEDURE FOR EACH
OF THESE