

## Working with data in your research and paper

Ioannis Konstantinidis

Sr. Researcher, Dept. of Computer Science

ikonstantinidis@uh.edu



These slides were manufactured on equipment that processes words. May contain typos, mistakes, or omissions.

On two occasions I have been asked,—"Pray, Mr. Babbage, if you put into the machine wrong figures, will the right answers come out?" ... I am not able rightly to apprehend the kind of confusion of ideas that could provoke such a question.

**Charles Babbage** (1791-1871) *Passages from the Life of a Philosopher*, ch. 5 "Difference Engine No. 1" (1864)





#### Does

- the statistical summary say what you *think* it says?
- the statistical summary give the *full* picture?
- the statistical test ask the *right* question?
- the statistical test say what you *think* it says?

# STATISTICAL SUMMARIES



Congratulations! Your dataset summaries look right But does your dataset contain "wrong figures"?



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- the statistical test say what you *think* it says?

#### If your weight is average, then

- A. You are as likely to run into someone that weighs more than you as you are to run into someone that weighs less than you
- B. If everyone else's weight changed to match yours exactly, elevator capacity signs could stay the same; but if everyone's weight changed to be double your weight, then elevator capacities would need to be cut in half
- C. None of the above

## If your weight is average, then

- A. Median
  - VS.
- B. Mean

## Text-based summary (by threshold)

#### Centrality

What **value** splits the observations in half? (half the values are above, the other half are below)

MEDIAN

The median describes RELATIVE POSITION for a SINGLE individual within an ENSEMBLE of peers

#### Text-based summary (by threshold)

#### Centrality

What **value** splits the observations in half? (half the values are above, the other half are below)

#### MEDIAN

The median describes RELATIVE POSITION for a SINGLE individual within an ENSEMBLE of peers We need to reorder the column of observations to compute (they must be in ascending / descending order) – standard LeetCode question!

## Text-based summary (in aggregate)



The mean compares CUMULATIVE VALUES for a POOLED ENSEMBLE of peers to a STANDARDIZED MEASURE (sum/#)

<sup>1</sup> to the number of observations

#### Text-based summary (in aggregate)

#### Centrality

How does the sum total of all values compare<sup>1</sup>?

MEAN

The mean compares CUMULATIVE VALUES for a POOLED ENSEMBLE of peers to a STANDARDIZED MEASURE (sum/#) Simple to compute, even on paper – no need to reorder the column of observations

<sup>1</sup> to the number of observations

#### MEAN as a stand-in for MEDIAN

If the histogram is symmetric,

i.e., for each value above the median,

there is a value at equal distance below the median

and vice versa

then all these differences will cancel each other out when we compute the sum total of all the values,

so the MEAN will be equal to the MEDIAN



If the histogram is not symmetric (we call that skew) then the MEDIAN and MEAN might be very different from each other



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Why does this matter?

#### MEAN is the flip-side of the MEDIAN

The mean is the POV of the house

Q: How <u>much</u> profit did the house *realize* (*per gambler*)?

A: The mean is equal to the profit per gambler

Note: This is not saying how many people profited/lost

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The median is the POV of the gambler

Q: How <u>many</u> gamblers in a group *realized a* profit?

A: If median > 0, then more than half profited; If median < 0, then less than half did

Note: This is not saying how <u>much</u> the profit/loss would be per gambler

## If your weight is average, then

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- B. If everyone else's weight changed to match yours exactly, elevator capacity signs could stay the same; but if everyone's weight changed to be double your weight, then elevator capacities would need to be cut in half
- C. Clothes fitted in your size are the most popular size option
- D. All of the above
- E. None of the above

#### Text-based summaries: three ways

Centrality	Dispersion
What <b>value</b> is the most popular?	How many values are very popular?
MODE	Modality
What <b>value</b> splits the observations in half? (half the values are above, the other half are below)	What <b>band of values</b> splits the observations in half? (half the values are inside, the other half are outside)
MEDIAN	IQR
How does the sum total of all <b>values</b> compare <sup>1</sup> ?	How does the sum total of all <b>deviations</b> <sup>2</sup> compare <sup>1</sup> ?
MEAN	Variance = (standard deviation) <sup>2</sup>

<sup>1</sup> to the number of observations, i.e., sum/#

<sup>2</sup> squared distances from the mean, i.e., (value-MEAN)<sup>2</sup>



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#### The Datasaurus

https://www.autodesk.com/research/publications/same-stats-different-graphs

#### STATISTICAL TESTS: meaningful differences



Congratulations! Your experiment found a difference in performance

#### STATISTICAL TESTS: meaningful differences



But should you be measuring <u>this</u> difference to begin with?