

Univariate Parametric & Nonparametric Statistics & Statistical Tests

- Kinds of variables & why we care
- Univariate stats
 - qualitative variables
 - parametric stats for ND/Int variables
 - nonparametric stats for ~ND/~Int variables
- Univariate statistical tests
 - tests qualitative variables
 - parametric tests for ND/Int variables
 - nonparametric tests for ~ND/~Int variables
 - of normal distribution shape for quantitative variables

Kinds of variable → The “classics” & some others ...

Labels

- aka → identifiers
- values may be alphabetic, numeric or symbolic
- different data values represent unique vs. duplicate cases, trials, or events
- e.g., UNL ID#

Nominal

- aka → categorical, qualitative
- values may be alphabetic, numeric or symbolic
- different data values represent different “kinds”
- e.g., species

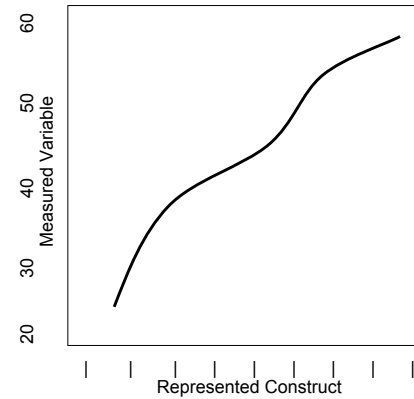
Ordinal

- aka → rank order data, ordered, seriated data
- values may be alphabetic or numeric
- different data values represent different “amounts”
 - only “trust” the ordinal information in the value
 - don’t “trust” the spacing or relative difference information
- has no meaningful “0”
 - don’t “trust” ratio or proportional information
- e.g., 10 best cities to live in
 - has ordinal info → 1st is better than 3rd
 - no interval info → 1st & 3rd not “as different” as 5th & 7th
 - no ratio info → no “0th place”
 - no prop info → 2nd not “twice as good” as 4th
 - no prop dif info → 1st & 5th not “twice as different” as 1st & 3rd

Interval

- aka → numerical, equidistant points
- values are numeric
- different data values represent different “amounts”
 - all intervals of a given extent represent the same difference anywhere along the continuum
 - “trust” the ordinal information in the value
 - “trust” the spacing or relative difference information
- has no meaningful “0” (0 value is arbitrary)
 - don’t “trust” ratio or proportional information
- e.g., # correct on a 10-item spelling test of 20 study words
 - has ordinal info → 8 is better than 6
 - has interval info → 8 & 6 are “as different” as 5 & 3
 - has prop dif info → 2 & 8 are “twice as different” as 3 & 5
 - no ratio info → 0 not mean “can’t spell any of 20 words”
 - no proportional info → 8 not “twice as good” as 4

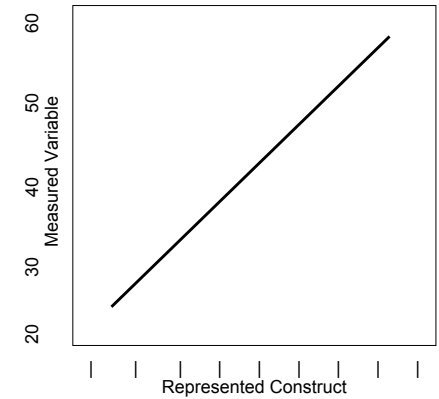
Ordinal Measure



Positive monotonic trace

“more means more but doesn’t tell how much more”

Interval Measure



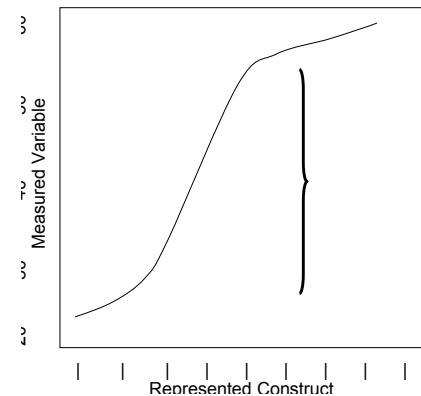
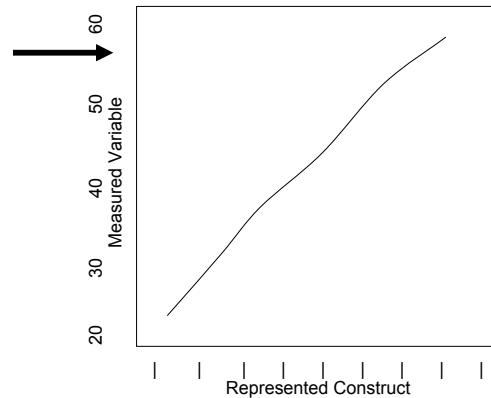
Linear trace

“more how much more”

$$y = mx + c$$

“Nearly” Interval Scale

- “good” summative scales
- how close is “close enough”



“Limited” Interval Scale

- provided interval data only over part of the possible range of the scale values / construct
- summative/aggregated scales

Binary Items

Nominal

- for some constructs different values mean different kinds
- e.g., male = 1 female = 2

Ordinal

- for some constructs can rank-order the categories
- e.g., fail = 0 pass = 1

Interval

- only one interval, so “all intervals of a given extent represent the same difference anywhere along the continuum”

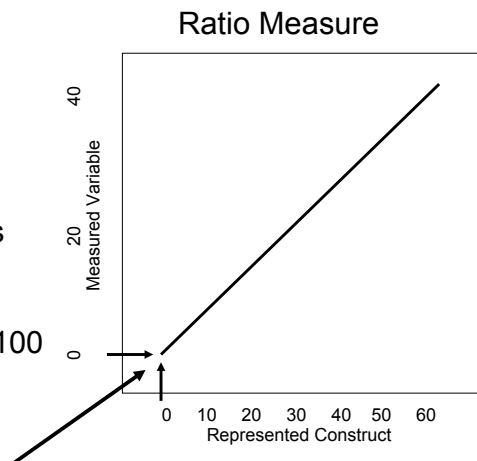
So, you will see binary variables treated as categorical or numeric, depending on the research question and statistical model.

Ratio

- aka → numerical, “real numbers”
- values are numeric
- different data values represent different “amounts”
 - “trust” the ordinal information in the value
 - “trust” the spacing or relative difference information
- has a meaningful “0”
 - “trust” ratio or proportional information
- e.g., number of treatment visits
 - has ordinal info → 9 is better than 7
 - has interval info → 9 & 6 are “as different” as 5 & 2
 - has prop dif info → 2 & 8 are “twice as different” as 3 & 5
 - has ratio info → 0 does mean “didn’t visit”
 - has proportional info → 8 is “twice as many” as 4

Pretty uncommon in Psyc & social sciences

- tend to use arbitrary scales
- usually without a zero
 - 20 5-point items → 20-100



Linear scale & “0 means none”

Linear trace w/ 0

“more how much more”

$$y = mx + c$$



Kinds of variables → Why we care ...

Reasonable mathematical operations

Nominal → ≠ =

Ordinal → ≠ < = >

Interval → ≠ < = > + - (see note below about * /)

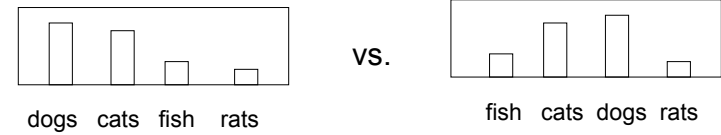
Ratio → ≠ < = > + - * /

Note: For interval data we cannot * or / numbers, but can do so with differences. E.g., while 4 can not be said to be twice 2, 8 & 4 are twice as different as are 5 & 3.

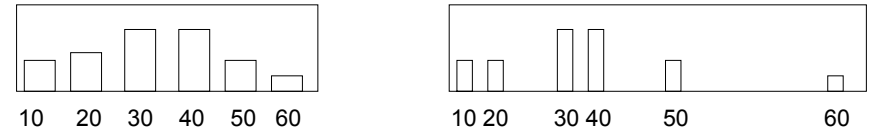
Data Distributions

We often want to know the “shape” of a data distribution.

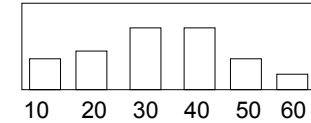
Nominal → can't do → no prescribed value order



Ordinal → can't do well → prescribed order but not spacing



Interval & Ratio → prescribed order and spacing



Univariate Statistics for qualitative variables

Central Tendency – “best guess of next case’s value”

- Mode -- the most common score(s)
- uni-, bi, multi-modal distributions are all possible

Variability – “index of accuracy of next guess”

- # categories
- modal gender is more likely to be correct guess of next person than is modal type of pet – more categories of the latter

Shape – symmetry & proportional distribution

- doesn't make sense for qualitative variables
- no prescribed value order

Parametric Univariate Statistics for ND/Int variables

Central Tendency – “best guess of next case’s value”

- mean or arithmetic average → $M = \Sigma X / N$
- 1st moment of the normal distribution formula
- since ND unimodal & symmetrical → mode = mean = mdn

Variability – “index of accuracy of next guess”

- sum of squares → $SS = \Sigma(X - M)^2$
- variance → $s^2 = SS / (N-1)$
- standard deviation → $s = \sqrt{s^2}$
- std preferred because is on same scale as the mean
- 2nd moment of the normal distribution formula
- average extent of deviation of each score from the mean

Parametric Univariate Statistics for ND/Int variables, cont.

Shape – “index of symmetry”

- skewness → $\frac{\Sigma (X - M)^3}{(N - 1) * s^3}$
- 3rd moment of the normal distribution formula
- 0 = symmetrical, + = right-tailed, - = left-tailed
- can’t be skewed & ND

Shape – “index of proportional distribution”

- kurtosis → $M = \Sigma X / N$ $\frac{\Sigma (X - M)^4}{(N - 1) * s^4} - 3$
- 4th moment of the normal distribution formula
- 0 = prop dist as ND, + = leptokurtic, - = platykurtic

The four “moments” are all independent – all combos possible

- mean & std “make most sense” as indices of central tendency & spread if skewness = 0 and kurtosis = 0

Nonparametric Univariate Statistics for ~ND/~Int variables

Central Tendency – “best guess of next case’s value”

- median → middle-most value, 50th percentile, 2nd quartile

How to calculate the Mdn

1. Order data values 11 13 16 18 18 21 22
2. Assign depth to each value, 11 13 16 18 18 21 22
starting at each end 1 2 3 4 3 2 1
3. Calculate median depth
 $D_{mdn} = (N+1) / 2$ $(7 + 1) / 2 = 4$
4. Median = value at D_{mdn} 18
(or average of 2 values @ D_{mdn} , if
odd number of values)

Nonparametric Univariate Statistics for ~ND/~Int variables

Variability – “index of accuracy of next guess”

- Inter-quartile range (IQR) → range of middle 50%, 3rd-1st quartile

How to calculate the IQR

- | | | | | | | | |
|--|-----------------------|----|----|----|----|----|----|
| | 11 | 13 | 16 | 18 | 18 | 21 | 22 |
| 1. Order & assign depth to each value | 1 | 2 | 3 | 4 | 3 | 2 | 1 |
| 2. Calculate median depth
$D_{Mdn} = (N+1) / 2$ | $(7 + 1) / 2 = 4$ | | | | | | |
| 3. Calculate quartile depth
$D_Q = (D_{Mdn} + 1) / 2$ | $(4 + 1) / 2 = 2.5$ | | | | | | |
| 4. 1 st Quartile value | Ave of 13 & 16 = 14.5 | | | | | | |
| 5. 3 rd Quartile value | Ave of 18 & 21 = 19.5 | | | | | | |
| 6. IQR – 3 rd - 1 st Q values | 19.5 – 14.5 = 5 | | | | | | |



Univariate Parametric Statistical Tests for qualitative variables

Goodness-of-fit χ^2 test

- Tests hypothesis about the distribution of category values of the population represented by the sample
- H₀: is the hypothesized pop. distribution, based on either ...
 - theoretically hypothesized distribution
 - population distribution the sample is intended to represent
 - E.g., 65% females & 35% males or 30% Frosh, 45% Soph & 25% Juniors
- R_H: & H₀: often the same !
- binary and ordered category variables usually tested this way
- gof χ^2 compares hypothesized distribution & sample dist.
- Retaining H₀: -- sample dist. “equivalent to” population dist.
- Rejecting H₀: -- sample dist. “is different from” population dist.

Data & formula for the gof χ^2

Frequency of different class ranks in sample

Frosh	Soph	Junior
25	55	42

$$\chi^2 = \sum \frac{(\text{observed} - \text{expected})^2}{\text{expected}}$$

Observed frequency – actual sample values (25, 55 & 42)

Expected frequency – based on a priori hypothesis

- however expressed (absolute or relative proportions, %s, etc)
- must be converted to expected frequencies

Example of a gof X^2

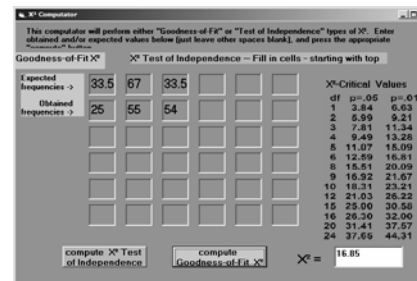
RH: “about ½ are sophomores and the rest are divided between frosh & juniors

Frosh	Soph	Junior
25	55	54

$$X^2 = \sum \frac{(\text{observed} - \text{expected})^2}{\text{expected}}$$

- Obtain expected frequencies
 - determine category proportions frosh .25 soph .5 junior .25
 - determine category freq as proportion of total (N=134)
 - Frosh $.25 \times 122 = 33.5$ Soph 67 Junior 33.5
- Compute X^2
 - $(25 - 33.5)^2/33.5 + (55-67)^2/67 + (54 - 33.5)^2/33.5 = 16.85$
- Determine df & critical X^2
 - df = k - 1 = 3 - 1 = 2
 - $X^2_{2,.05} = 5.99$ $x^2_{2,.01} = 9.21$
- NHST & such
 - $X^2 > X^2_{2,.01}$, so reject H_0 : at p = .01
 - Looks like fewer Frosh – Soph & more Juniors than expected

Doing gof X^2 “by hand” – Computators & p-value calculators



The top 2 rows of the X^2 Computator will compute a gof X^2

If you want to know the p-value with greater precision, use one of the online p-value calculators



Univariate Parametric Statistical Tests for ND/Int

1-sample t-test

Tests hypothesis about the mean of the population represented by the sample (μ -- “mu”)

- H_0 : value is the hypothesized pop. mean, based on either ...
 - theoretically hypothesized mean
 - population mean the sample is intended to represent
 - e.g., pop mean age = 19
- RH: & H_0 : often the same !
- 1-sample t-test compares hypothesized μ & x
- Retaining H_0 : -- sample mean “is equivalent to” population μ
- Rejecting H_0 : -- sample mean “is different from” population μ

Example of a 1-sample t-test

$$t = \frac{\bar{X} - \mu}{SEM} \quad SEM = (s^2 / n)$$

The sample of 22 has a mean of 21.3 and std of 4.3

1. Determine the H0: μ value
 - We expect that the sample comes from a population with an average age of 19 $\mu = 19$
2. Compute SEM & t
 - $SEM = 4.3^2 / 22 = .84$
 - $t = (21.3 - 19) / .84 = 2.74$
3. Determine df & t-critical or p-value
 - $df = N-1 = 22 - 1 = 21$
 - Using t-table $t_{21,.05} = 2.08$ $t_{21,.01} = 2.83$
 - Using p-value calculator $p = .0123$
4. NHST & such
 - $t > t_{2,.05}$ but not $t_{2,.05}$ so reject H0: at $p = .05$ or $p = .0123$
 - Looks like sample comes from population older than 19



Univariate Parametric Statistical Tests for ~ND/~In

1-sample median test

Tests hypothesis about the median of the population represented by the sample H0: value is the hypothesized pop. median, based on either ...

- theoretically hypothesized mean
- population mean the sample is intended to represent
- e.g., pop median age = 19
- RH: & H0: often the same !
- 1-sample median test compares hypothesized & sample mdns
- Retaining H0: -- sample mdn "is equivalent to" population mdn
- Rejecting H0: -- sample mdn "is different from" population mdn

Example of a 1-sample median test

age data → 11 12 13 13 14 16 17 17 18 18 18 20 20 21 22 22

1. Obtain obtained & expected frequencies
 - determine hypothesized median value → 19
 - sort cases in to above vs. below H0: median value
 - Expected freq for each cell = $\frac{1}{2}$ of sample → 8
2. Compute X^2
 - $(11 - 8)^2/8 + (5 - 8)^2/8 = 2.25$

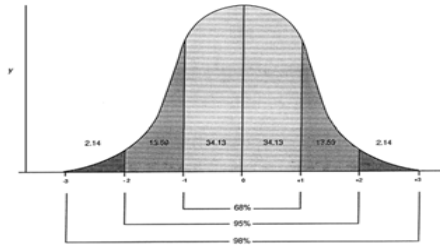
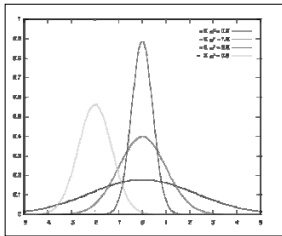
<19	>19
11	5
3. Determine df & X^2 -critical or p-value
 - $df = k-1 = 2 - 1 = 1$
 - Using X^2 -table $X^2_{1,.05} = 3.84$ $X^2_{1,.05} = 6.63$
 - Using p-value calculator $p = .1336$
4. NHST & such
 - $X^2 < X^2_{1, .05}$ & $p > .05$ so retain H0:
 - Looks like sample comes from population with median not different from 19



Tests of Univariate ND

One use of gof X^2 and related univariate tests is to determine if data are distributed as a specific distribution, most often ND.

No matter what mean and std, a ND is defined by symmetry & proportional distribution



Using this latter idea, we can use a gof X^2 to test if the frequencies in segments of the distribution have the right proportions

- here we might use a $k=6$ gof X^2 with expected frequencies based on % of 2.14, 13.59, 34.13, 34.13, 13.59 & 2.14

Tests of Univariate ND

One use of t-tests is to determine if data are distributed as a specific distribution, most often ND.

ND have skewness = 0 and kurtosis = 0

Testing Skewness

$$t = \text{skewness} / \text{SES}$$

Standard Error of Skewness

$$\text{SES} \approx \sqrt{(6 / N)}$$

Testing Kurtosis

$$t = \text{kurtosis} / \text{SEK}$$

Standard Error of Kurtosis

$$\text{SEK} \approx \sqrt{(24 / N)}$$

Both of these are “more likely to find a significant divergence from ND, than that divergence is likely to distort the use of parametric statistics – especially with large N.”