

Department of Clinical Research



Data Analysis Plan: 10 things to remember Clinical Research Update Seminar

Marco Cattaneo, 25 October 2022

1 what?

2 when?

3 why?

4 how?

Data Analysis Plan: 10 things to remember, Marco Cattaneo, 25 October 2022

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(it's in the name: a plan for the statistical analysis)

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(the main conceptual question: it is often required, but why?)

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(the main practical question: what should it include and how detailed?)

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SAP examples: SICS-I and CanCovDia

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personal experience: on average preparing the dataset (IDA), writing the SAP, and performing the analysis each take roughly the same time





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- Mood's test for difference in median (log-)outcome: p=0.158

Silberzahn and Uhlmann: Many hands make tight work [Nature, 2015]:



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- the dependence of the results on the performed analysis shows the importance of a careful choice of analysis methods and of performing sensitivity analyses to assess the robustness and credibility of the results
- it can be highly problematic when the choice of the reported analyses depends on the results (or more generally of the data: changes to the SAP after a blind review of the data should be well motivated and documented)
- in particular, *p*-hacking (analyzing a question in different ways until a statistically significant result is obtained) and *data dredging* (analyzing many questions and selecting the statistically significant results) lead to too many false positive results (**multiple testing problem**)

baseline characteristics of a randomized controlled trial [PLOS One, 2015]: 1 false positive in 23 tests (expected: 1 in 20)

Variable	MIT (N = 13)	HIIT (N = 15)	p-Value
Age (yrs)	20.0 (1.5)	20.0 (1.5)	0.7321
African-American	6 (46%)	2 (13%)	0.0957
Weight (kg)	89.7 (15.8)	94.3 (12.1)	0.4049
BMI (kg/m ²)	29.0 (3.4)	30.0 (3.1)	0.4215
Percent fat (%)	29.49 (5.08)	34.08 (6.45)	0.0454
VO ₂ Peak (ml/kg/min)	34.95 (6.46)	35.72 (6.22)	0.7505
Peak Power (watts)	1022.4 (179.8)	891.0 (296.6)	0.1638
Resting Metabolic Rate (kcal/day)	1806.3 (215.3)	1835.4 (232.5)	0.7339
Total cholesterol (mg/dL)	163.0 (26.6)	169.3 (25.4)	0.5268
Triglycerides (mg/dL)	128.3 (103.7)	122.5 (55.9)	0.8228
HDL-cholesterol (mg/dL)	50.1 (9.2)	46.9 (10.6)	0.3985
LDL-cholesterol (mg/dL)	90.6 (16.8)	100.1 (19.4)	0.1762
Large VLDL Particles	5.18 (8.6)	3.3 (2.9)	0.5157
Medium VLDL Particles	25.81 (25.5)	24.55 (18.3)	0.8068
Small VLDL Particles	23.53 (11.5)	25.73 (16.3)	0.2355
Large HDL Particles	5.14 (2.7)	4.11 (2.2)	0.1665
Medium HDL Particles	11.63 (5.3)	13.75 (3.6)	0.6737
Small HDL Particles	15.53 (4.9)	12.91 (3.4)	0.355
SBP (mm Hg)	126.5 (12.7)	129.5 (9.7)	0.4890
DBP (mm Hg)	71.2 (6.9)	68.8 (7.0)	0.3727
Insulin Sensitivity (S _I)	4.57 (3.20)	3.60 (1.89)	0.3504
HOMA-IR	2.73 (1.55)	2.73 (1.33)	0.9990
QUICKI	0.3397 (0.0349)	0.3363 (0.0271)	0.7814

Table 2: Baseline characteristics of the two treatment groups. Values are Mean (SD) or N (%). Continuous variables were compared with a two-sample I-test with a Satterthwaite adjustment. Categorical variables were compared using Fisher's exact test. Bolfdace values indicate significance of differences (P < 0.05).

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University of Basel, Department of Clinical Research 10

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Baker: Is there a reproducibility crisis? [Nature, 2016]:



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- the only real drawback of SAPs for observational studies is costing time and resources for results that may anyway be of limited credibility

what should a SAP include? a brief overview:

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- plan of how baseline characteristics will be summarized and possibly of which information will be included in a CONSORT flow diagram

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- description of planned exploratory analyses, which can be quite vague (but pre-specified exploratory analyses are usually considered a bit more credible than exploratory analyses tout court)

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- if you torture the data enough, nature will always confess [Coase, 1982]



Department of Clinical Research



Thank you for your attention