

Being approximately correct and being precisely wrong

1. Refer to the descriptions of the SMOG index, the Fry method, the Flesch Reading Ease, and the Flesch-Kincaid Grade Level, for measuring *read-ability* (under Resources for Measurement/Surveys).<sup>1</sup>

For the article or text you have chosen (as per discussion in class), randomly select three separate 100 word passages, and use this set of three passages to measure the readability  $(F_1)$  using the Fry graph. Rather than do so manually, you can use the SMOG calculator to determine the average number of sentences and syllables per hundred words. Repeat the readability measurement  $(F_2)$  with a second different set of three passages. Repeat once more  $(F_3)$ , using a third set.

Using these same three sets, calculate the SMOG index, the Flesch Reading Ease, and the Flesch-Kincaid Grade Level.

For each index, use the 3 estimates to calculate the standard error of measurement, and the coefficient of variation. Comment.

- 2. Propose a method to assess the *validity* of a readability index.
- 3. **[m-s]** Derive the link between the standard error of measurement and the (intraclass correlation) reliability coefficient [last line, column 1, p. 7 of notes on "Quantifying Reliability" in Notes on Psychometrics for students in rehabilation sciences in Resources for Measurement/Surveys. *Hint: it's simply a matter of using the definition of R.*
- 4. [m-s] Exercise in section 3: Relationship between test-retest correlation and ICC(X) [In notes on Effect of Errors in X and Y on measured correlation and slope]

- 5. **[m-s]** Exercise section 4: Relationship between  $\operatorname{correlation}(X, X')$  and  $\operatorname{ICC}(X)$  [ibid.]
- 6. Francis Galton (1822-1911) found that the correlation between (*self-reported*) parental and (adult) offspring heights was strongest for the one between father and son  $[0.396 \pm 0.024]$ , and weakest for the one between mother and daughter  $[0.284 \pm 0.028]$ . Given the way he obtained the measurements, can you imagine why this was?

[It was  $0.302\pm0.027$  for mother & son;  $0.360\pm0.026$  for father & daughter.]

15	TU	DA 10				
-	Father	Mother	Sons in order of height	Daughters in order of height.		
1	18.5	7.0	13.2	9.2, 9.0, 9.0		
		THAT.				
2	15.5	6.5	13.5, 12.5	5.5, 5.5		
3	15.0	about 4-0	11:0	8.0		
4	15.0	4.0	10.5, 8.5	7.0, 4.5, 3.0		
5	15.0	-1.5	12.0, 9.0, 8.0	6.5, 2.5, 2.5		
6	11.0					
4	14.0	8.0	16.0	9.5		
0	14.0	0.0	10.5, 14.0, 13.0, 13.0	10.5, 4.0		
0	14.0	6.0		10.5, 8.0, 6.0		
9	14.5	5.0		0.0		
11	14.0	2.0	11.0 10.0	5.5		
12	11.0	1:0	14.0, 10.0	8.0, 7.0, 7.0, 6.0, 3.5, 3		
1	140			5.0		
13	13.0	7.0	11.0	2 GALTON F		
14	13 -0	7.0	2.0 8.0 %.0	2.0 PAPERS OF		
15	13.0	60		12428		
16	13.0	1 + 5 1	12.0, 10.5	0.7		
17	13.0	1.5	12.0, 10.3, 10.2, 10.2, 4.2	0.7, 0.3, 4.3, 5.3		
18	13.0	4.0	1.0, 0.0, 1.5, 10.5	60, 2.3		
10	18.2	3.0		0.0, 4.3, 4.0		
14						
20	12.7	9.0	13.2, 13.0, 12.7	10.0, 9.0, 8.5, 8.0 6.0		
21	12.0	8.0	13.0	8.5. 8.0		
22	12.0	abt. 7.0	13.0. 11.0	7.0		
23	12.0	5.0	14.2. 10.5 0.5	6.0. 5.5. 5.0 5.0		
91	100	150	2.2 7.5 2.5			

Family heights: Page 1/8 of notebook in Galton Papers : see "Galton's family data on human stature" on JH's website

 $<sup>^1{\</sup>rm ToneCheck}\ ({\tt http://tonecheck.com/})$  is another interesting tool. See story at <code>http://www.montrealgazette.com/search/search.html?q=ToneCheck</code>

7. Bridging the physical- and the psycho-metric: The notes on "Increasing Reliability by averaging several measurements" on the right hand column of page 4 of JH's notes on Quantifying Reliability give the formula for the so-called "Stepped-Up Reliability". In psychometrics (where the number of items on a test serves as the "several measurements") this formula serves as the basis for the "Spearman-Brown prediction formula".<sup>2</sup>

[m-s] Invert the formula on p.4 to derive the one on the right hand column of p.1 for Spearman-Brown prediction formula relating the reliability of two versions of a test, one with N times more items than the other.

8. You are trying to estimate, from imperfect observations of F and C, the values of the two coefficients  $B_0$  and  $B_1$  in the temperature relation  $F = B_0 + B_1 \times C$ .

For each of the following situations, and using the true values of  $B_0 = 32$ and  $B_1 = 9/5 = 1.8$ , simulate<sup>3</sup> 1000 datasets & investigate the behaviour of the 1000 estimates,  $b_0$  and  $b_1$ , of  $B_0$  and  $B_1$ . In each simulation, use samples of size n = 4, with temperatures of C = 14, 16, 18 and 20.

(a) C measured perfectly, F measured with  $\epsilon_F \sim \text{Gaussian}(\mu = 0, \sigma_{\epsilon_F} = 1)$  errors that are independent of F. Check – formally, using a test (or CI) based on the mean of the 1000 estimates – for evidence of bias in  $b_1$ . Also check whether the empirical variance of  $b_1$  agrees with that given by the theoretical formula, namely

$$Var(b_1) = \sigma_{\epsilon_F}^2 / \sum (x - \bar{x})^2.$$

(b) F measured perfectly, C measured with  $\epsilon_C \sim \text{Gaussian}(\mu = 0, \sigma_{\epsilon_C} = 1)$  errors that are independent of C [*Classical type* error: someone else chose situations when C was indeed exactly 14, 16, etc, but didn't tell you what C was, and instead asked you to independently record C using your own imperfect instrument, and to use *your* recordings of C in your estimation of the equation]. Again, formally test for evidence of bias in  $b_1$ .

Do your findings line up with the predictions in the Notes? If the patterns are difficult to see, you might change the number of simulations, the sizes of the errors, the range of C or the sample size.<sup>4</sup>

 $^{2} \tt http://en.wikipedia.org/wiki/Spearman-Brown_prediction_formula \ .$ 

## XXI. Experiments to determine the Density of the Earth. By Henry Cavendish, Esq. F.R.S. and A.S.

## Read June 21, 1798.

 $M_{\rm ANY}$  years ago, the late Rev. JOHN MICHELL, of this Society, contrived a method of determining the density of the earth, by rendering sensible the attraction of small quantities of matter; but, as he was engaged in other pursuits, he did not complete the apparatus till a short time before his death, and did not live to make any experiments with it. After his death, the apparatus came to the Rev. FRANCIS JOHN HYDE WOLLASTON, Jacksonian Professor at Cambridge, who, not having conveniences for making experiments with it, in the manner he could wish, was so good as to give it to me.

					1. 201. 1.1	and the second second
Exper.	Mot. weight	Mot. arm	Do. corr.	Time vib	Do. corr.	Density.
1 {	m. to + + to m.	14,32 14,1	13,42 13,17	, " 14,55	-	5,5 5,61
2 }	m. to $+$	15,87	14,69	-	-	4,88
	+ to m.	15,22	13,56	14,39	-	5,26
	m. to + m. to +	14,5 3,1	13,28 2,95	14,54	- 6,54	5,55 5,36
43	+ to $-$	6,18	-	7,1	-	5,29
ر ج	+ to -	5,92 5,9	- <b>-</b>	7,5	ka je sa se	5,65
· · · · · · · · · · · · · · · · · · ·	- to $+$ m. to $-$	5,98	- 2.0	7,5		5.57 5.58
6.	-to +	5,9	5,71	7.4	-	5,62
7	- to +	3,15 6,1	3,03 5,9	by by	6,57	5,29 5,44
8	m. to $-$	3,13	3,00 5.54		-	5,34
9	+ to -	6,32	-	6,58	e <u>-</u> sui	5,1
10	+ 10 -	6.07	· - ·	0,59	-	5,27
12	-t0 +	6.00	_	7.9	a Eusi	5.42
13	-to +	6,12	-	7,6		5,47
14	- to $+$	5,97	-	7,6	-	5,34
{	4 to	6,13	-	7,6		5,40
15	-t0+	6.1	_	7.16	-	5,75
<u> </u>	to	5,78	-	7,2	j - <b>-</b> - <sup>-</sup>	5,68
- 17 {	+ to	5,64	<b>–</b> -	7,3	-	5,85

The following Table contains the Result of the Experiments.

http://en.wikipedia.org/wiki/Cavendish\_experiment: Cavendish found that the Earth's density was 5.448  $\pm$  0.033 times that of water (due to a simple arithmetic error, found in 1821, the erroneous value 5.48  $\pm$  0.038 appears in his paper).

2

<sup>&</sup>lt;sup>3</sup>If new to simulations, see "Computer code to simulate datasets with measurement error" at the bottom of the Resources webpage for measurement/surveys. It gives some 'starter' computer code, which you can modify to suit.

 $<sup>^{4}</sup>$ The article by Hutcheon et al. "Random measurement error and regression dilution bias", under 'r e p r i n t s' on JH's home page, tries to explain these patterns intuitively.