

Properties of log transformations and backtransformations

Example uses hamburger bacterial concentration (data in hamburger.csv)

Reminder on study design:

2 treatments (active, control), 6 observations per treatment

One unusual cfu that isn't so unusual on the log scale

Summary statistics:

	Active	Control	Diff
average cfu	0.11	0.72	
median cfu	0.11	0.44	
average log cfu	-2.535	-0.769	1.76

Three properties of logs, means and medians

1. $\exp(\text{average log } Y) \neq \text{average } Y$

Control group: $\exp(-0.769) = 0.46$

not close to the data mean, 0.72

Details on why this is the case:

model: $\log Y \sim N(\mu_l, \sigma_l^2)$

Math Stat fact: mean $Y = \exp(\mu_l + \sigma_l^2/2)$

$\overline{\log Y}$ estimates μ_l

$\exp \overline{\log Y}$ estimates $\exp \mu_l$

but mean $Y = \exp(\mu_l + \sigma_l^2/2) = (\text{what } \exp \overline{\log Y} \text{ estimates}) \times (\exp \sigma_l^2/2)$

$\exp \overline{\log Y}$ systematically smaller than the mean

How much smaller depends on σ_l

2. Back-transforming average log Y estimates the median of Y , not the mean

Control group: $\exp -0.769 = 0.46$, close to the data-based median = 0.44

The details:

median ($\log Y$) = $\log(\text{median } Y)$

When $\log Y$ approximately symmetrical (i.e., not skewed), median = mean

When exactly symmetrical:

median ($\log Y$) = mean ($\log Y$), estimated by average ($\log Y$)

$\exp \text{ average } \log Y = \exp \log(\text{median } Y) = \text{median } Y$ Two different ways (data median, back transformation) to estimate the same parameter

Two different estimators usually give different estimates

Lots of theory on which is better and under what conditions

3. Back transforming the difference of average log Y estimates the ratio of medians

diff = average log Y_1 - average log Y_2 = median log Y_1 - median log Y_2

= $\log(\text{median } Y_1) - \log(\text{median } Y_2)$

= $\log(\text{median } Y_1/\text{median } Y_2)$

so $\exp \text{ diff} = \exp \log(\text{median } Y_1/\text{median } Y_2)$

= median $Y_1/\text{median } Y_2$