PO91Q: Fundamentals in Quantitative Research Methods

Worksheet Week 7 - Solutions



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1 | Crosstabulations – Calculations by Hand

Expected Values:

| | Mode of Transport | | | |
|-------------|-------------------|-------------|--------|----------|
| Department | Bike | Bus | Car | Total |
| PAIS CIM | 7.2 10.8 | 6.8 10.2 | 6 9 | 20 30 |
| Total | 18 | 17 | 15 | 50 |

- Calculate the χ^2 -value
 - (2.8867)
- · How many degrees of freedom does this table have? Why?
 - (2)
- Using the χ^2 Table, what is the p-value?
 - (0.236, or between 0.250 and 0.100)
- Are mode of transport and departmental association independent in the population?
 - (Yes)

2 | Correlation

Linear relationships

- 1. Increasing n from 50 to 300 makes the sample r cling more tightly to the target (≈0.60), narrows its confidence interval, and yields a much smaller p-value. This shows that larger samples reduce sampling variability and increase power.
- 2. With a small true effect ($r \approx 0.20$) and n = 60, the observed r can bounce widely across seeds and may even flip sign occasionally. This instability comes from high sampling error relative to the weak signal.



Non-linear and non-monotonic (Quadratic)

- 3. Often yes: r can be near zero despite a clear U-shape. The positive and negative slopes on either side of the minimum/maximum cancel in a linear summary, masking the strong but non-linear association.
- 4. When Noise is large enough that the two arms blur together (threshold depends on n and the scale), both the straight line and LOESS become close to flat and similarly uninformative.

Non-linear but monotonic (Cubic)

- 5. Yes. The straight line averages across the curve and often understates the visible relationship (sometimes showing a small slope). LOESS follows the bend and reveals a strong monotonic trend.
- 6. As Noise increases, r typically declines quickly toward zero because curvature plus added noise erodes linear association. The LOESS curve still shows the underlying shape longer, revealing curvature even when r is small.

Comparing fits (lines)

- 7. For a curved monotonic pattern, the straight line can imply weak or even misleading direction, while LOESS shows the true increasing pattern with curvature (steeper ends, flatter middle).
- 8. In Linear mode (truly linear data), LOESS and the least-squares line essentially coincide, especially as n grows, because the best smooth for a straight-line signal is a straight line.

Sampling variability and reproducibility

- 9. With r = 0.40 and n = 80, r typically varies noticeably across seeds (often on the order of ±0.1 or so). With n = 400, the variability shrinks substantially (often to just a few hundredths), illustrating how larger n stabilizes estimates.
- 10. For Cubic with low Noise, r is moderately stable but still more variable than in a truly linear case because the linear summary is sensitive to where the curve is sampled. Stability improves with larger n and lower Noise.

Same r, different story

11. You can tune Cubic (noise) to get a Pearson r similar to a Linear scenario (e.g., both around 0.5). The plots differ: Linear looks elliptical with a constant slope; Cubic is curved. LOESS highlights this curvature, showing why the same r can represent different relationships.

Reflections

- 12. Pearson's r is adequate when the relationship is approximately linear and residual variation is roughly symmetric and homoscedastic. Prefer a non-linear description when you see curvature or non-monotonic structure that a straight line cannot capture.
- 13. Justify a non-linear model when LOESS departs clearly from the straight line, residuals show systematic patterns, and a non-linear fit improves predictive performance (e.g., lower residual error, better cross-validated metrics) while matching the visible shape in the plot.

3 | Applied Exercises in R (Core & Going Further)

See RScript in the Online Companion