

## 0.1 The simulation result of the three statistic

### 0.1.1 The three statistic

Consider a two-way contingency table,  $N = (n_{ij}, i = 1, 2, \dots, I, j = 1, 2, \dots, J)$ , that cross classifies  $n$  individuals/units according to  $I$  row categories and  $J$  ordered (ascending) column categories. Let the observed frequency in  $(i, j)$ th cell be  $n_{ij}$ , the column total frequency be  $n_{+j} = \sum_i n_{ij}$ , the row total frequency be  $n_{i+} = \sum_j n_{ij}$ . the matrix of proportions is denoted by  $P = n^{(-1)}N$ , the marginal relative of  $i$ th row and  $j$ th column of  $N$  are  $p_{i+} = n_{i+}/n, p_{+j} = n_{+j}/n$ .

For row  $i$ , consider the cumulative frequencies  $Rz_{ij} = \sum_{l=1}^j n_{il}, l = 1, 2, \dots, J$ , and the relative cumulative proportions  $Rd_j = \sum_{l=1}^j n_{+l}$ , for column  $j$ , consider the cumulative frequencies  $Cz_{ij} = \sum_{k=1}^i n_{kj}, k = 1, 2, \dots, I$ , and the relative cumulative proportions  $Cd_i = \sum_{k=1}^i n_{k+}$ , consider the  $i$  and  $j$  in the meaning time, the cumulative frequencies  $RCz_{ij} = \sum_{k=1}^i \sum_{l=1}^j n_{kl}$

1.  $F(y|x) - F(y)$  (Nair 1978 JASA)

$$T1 = \sum_{j=1}^{J-1} \omega_j^y \left[ \sum_{i=1}^I n_{i+} \left( \frac{Rz_{ij}}{n_{i+}} - Cd_i \right)^2 \right]$$

2.  $F(x|y) - F(x)$

$$T2 = \sum_{i=1}^{I-1} \omega_i^x \left[ \sum_{j=1}^J n_{i+} \left( \frac{Cz_{ij}}{n_{+j}} - Rd_j \right)^2 \right]$$

3.  $F(x, y) - F(x)F(y)$

$$T3 = \sum_{i=1}^{I-1} \sum_{j=1}^{J-1} \omega_{ij}^{xy} n \left( \frac{RCz_{ij}}{n} - Rd_j Cd_i \right)^2$$

(Nair 1978 JASA) show the  $\omega_j^x = Rd_j(1 - Rd_j)$ , and The  $T1$  has good power When  $\omega_j^x = 1/J$ , so we let  $w_i^y = 1/I, w_{ij}^y = I \times J$  and we have the  $T1, T2, T3$  as follow:

1.  $F(y|x) - F(y)$  (Nair 1978 JASA)

$$T1 = \frac{1}{J} \sum_{j=1}^{J-1} \left[ \sum_{i=1}^I n_{i+} \left( \frac{Rz_{ij}}{n_{i+}} - Cd_i \right)^2 \right]$$

2.  $F(x|y) - F(x)$

$$T2 = \frac{1}{I} \sum_{i=1}^{I-1} \left[ \sum_{j=1}^J n_{i+} \left( \frac{Cz_{ij}}{n_{+j}} - Rd_j \right)^2 \right]$$

3.  $F(x, y) - F(x)F(y)$

$$T3 = \frac{1}{IJ} \sum_{i=1}^{I-1} \sum_{j=1}^{J-1} n \left( \frac{RCz_{ij}}{n} - Rd_j Cd_i \right)^2$$

### 0.1.2 The difference from Li's paper

The association between  $(Y|Z)$  and  $(X|Z)$ (Li 2010 JASA)

$X, Y$  is independent  $\rightarrow (Y|Z), (X|Z)$  independent, but not vice versa

### 0.1.3 Generate ordinal data(具体产生算法正确与否有待讨论)

Deriving from the (Li 2010 JASA), but don't generate the covariate  $Z$ .

The specifics of our four generating scenarios are as follows: we first generated  $X$  with five categories using the proportion odds model

$$P(X \leq i) = [1 + \exp(-(\alpha_i^X))]^{-1}$$

with  $\alpha^X = (\alpha_1^X, \alpha_2^X, \alpha_3^X, \alpha_4^X) = (-1, 0, 1, 2)$ . The  $Y$  was generated with four levels using the proportional odds model

$$P(Y \leq j) = [1 + \exp(-(\alpha_i^Y + \eta_1 I_{\{X=1\}} + \eta_2 I_{\{X=2\}} + \cdots + \eta_5 I_{\{X=5\}}))]^{-1}$$

with  $\alpha^Y = (\alpha_1^Y, \alpha_2^Y, \alpha_3^Y) = (-1, 0, 1)$ , and  $\boldsymbol{\eta} = (\eta_1, \eta_2, \dots, \eta_5)$  specified as

1.  $\boldsymbol{\eta} = (0, 0, 0, 0, 0)$ (the null)
2.  $\boldsymbol{\eta} = (-0.4, -0.2, 0, 0, 2, 0, 4)$ (linear effect)
3.  $\boldsymbol{\eta} = (-0.30, -0.18, 0.20, 0.22, 0.24)$ (monotonic nonlinear effect)
4.  $\boldsymbol{\eta} = (-0.2, 0, 0.2, 0, -0.2)$ (nonmonotonic effect)

### 0.1.4 The process of simulation(具体算法正确与否有待讨论)

My process(Different from the (Li 2010 JSAS)'s process)

- Simulate the *null distribution*.

Generate  $N_{rep}=1000000$  datasets from the null hypothesis, each consisting of  $N=500$  subjects. computer  $N_{rep}$  three statistics.

- Computer the *Type I error*:

Generate  $N_{reptest}=100000$  datasets from the null hypothesis, each consisting of  $N$  subjects. computer  $N_{reptest}$  three statistics.

- Computer the *power*

Generate  $N_{reptest}$  datasets from the alternative hypothesis, each consisting of  $N$  subjects. computer  $N_{reptest}$  three statistics.

### Li's process

- Generate a data sets D1,consisting N=500 subjects, computing the statistic
- Relying on D1 ,generate Nemp=1000 data sets as the null distribution, computing a p-value.
- repeating step1-step2 Nrepl=1000. gain Nrepl=1000 p-value,computing the Type I error and power

### 0.1.5 The result

Nrep=1000000,Nreptest=100000,N=500,Time=26400.44s=7.3h

**Table 1.** The result of the three statistics :Type I error and power

| Analysis method | Simulation scenarios |         |           |              |
|-----------------|----------------------|---------|-----------|--------------|
|                 | Null                 | Linear  | Nonlinear | Nonmonotonic |
| T1              | 0.04948              | 0.75114 | 0.57597   | 0.28759      |
| T2              | 0.04999              | 0.78369 | 0.47814   | 0.11663      |
| T3              | 0.04964              | 0.89773 | 0.65047   | 0.17715      |
| X linear        | 0.04906              | 0.91231 | 0.59056   | 0.07404      |
| X categorcial   | 0.04974              | 0.76194 | 0.58867   | 0.29465      |
| Spline          | 0.04926              | 0.85319 | 0.63418   | 0.38027      |