

# Cochran-Mantel-Haenszel

FK6193

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# Historically

- Pearson's Chi-Square Test (1904)
- Likelihood Ratio Test
- Cochran Test (1954)
- Mantel-Haenszel Test (1959)
- Breslow-Day Test (1980)
- Tarone (1985)

# Mantel-Haenszel

- An excellent method for adjusting for confounding factors when analysing the relationship between a dichotomous risk factor and a dichotomous outcome.

# Example

- Those with high catecholamine are believed to be of high risk for coronary heart disease. However age & ECG changes are probable confounders.
  - RF - Catecholamine (Low / High)
  - Outcome - CHD (Present / Absent)
  - Confounders
    - Age (<55, 55+)
    - ECG ( +, - )

# Combine All

	CHD +	CHD -	
High Cat	27(22.1%)	95	122
Low Cat	44(9.0%)	443	487
	71	538	609

Crude OR = 2.86,  $X^2=16.25$

# Stratification

- To control confounding factors, we divide the sample into a series of strata, which are now internally homogenous with regards to the confounding factors.
- The odds ratio calculated within each stratum are free of bias arising from confounding.

# Age < 55, ECG -

	CHD +	CHD -	
High Cat	1(12.5%)	7	8
Low Cat	17(6.2%)	257	274
	18	264	282

$$OR = (1 \times 257)/(7 \times 17) = 2.16$$

# Age < 55, ECG +

	CHD +	CHD -	
High Cat	3(17.6%)	14	17
Low Cat	7(11.9%)	52	59
	10	66	76

$$OR = (3 \times 52)/(14 \times 7) = 1.59$$



# Age 55+, ECG -

	CHD +	CHD -	
High Cat	9(23.1%)	30	39
Low Cat	15(12.3%)	107	122
	24	137	161

$$OR = (9 \times 107)/(30 \times 15) = 2.14$$

# Age 55+, ECG +

	CHD +	CHD -	
High Cat	14(24.1%)	44	58
Low Cat	5(15.6%)	27	32
	19	71	90

$$OR = (14 \times 27)/(44 \times 5) = 1.72$$

# Odds Ratio

Stratum	Risk +	Risk -	OR
<55, ECG+	3(17.6%)	7(11.9%)	1.59
55+, ECG+	14(24.1%)	5(15.6%)	1.72
55+, ECG-	9(23.1%)	15(12.3%)	2.14
<55, ECG-	1(12.5%)	17(6.2%)	2.16
Combined	27(22.1%)	44(9.0%)	2.86

$$CI=OR.\exp_{\pm 1.96\sqrt{1/a+1/b+1/c+1/d}}$$

Stratum	OR	Lower	Higher
<55, ECG+	1.59	0.36	6.96
55+, ECG+	1.72	0.56	5.31
55+, ECG-	2.14	0.85	5.37
<55, ECG-	2.16	0.25	18.58
Combined	2.86	1.69	4.85

# Odds Ratio

Stratum	OR
<55, ECG+	1.59
55+, ECG+	1.72
55+, ECG-	2.14
<55, ECG-	2.16
Combined	2.86

- Despite stratification, stress constantly leads to higher odds (but not significant) of getting CHD.
- There seems to be little effect modification due to age and ECG. The odds are similar. But combined table stronger & highly significant  $OR=2.86; 1.69 < OR < 4.85$ .
- Need an adjusted summary measure & adjust for effect of age & ECG.

# Chi-Square Cochran-Mantel-Haenszel

$$X_{MH}^2 = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a + b) \times (c + d) \times (a + c) \times (b + d)}{(n - 1) \times n^2} \right)}$$

# Testing for Overall Association

	D+	D-	
E+	a	b	a+b
E-	c	d	c+d
	a+c	b+d	n

$$X_{MH}^2 = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a+b) \times (c+d) \times (a+c) \times (b+d)}{(n-1) \times n^2} \right)}$$

# Age < 55, ECG -

	CHD +	CHD -	
High Cat	1	7	8
Low Cat	17	257	274
	18	264	282

$$X_{MH}^2 = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a+b) \times (c+d) \times (a+c) \times (b+d)}{(n-1) \times n^2} \right)}$$

$$\left[ \frac{1 \cdot 257 - 17 \cdot 7}{282} + \frac{3 \cdot 52 - 7 \cdot 14}{76} + \frac{9 \cdot 107 - 15 \cdot 30}{161} + \frac{14 \cdot 27 - 5 \cdot 44}{90} \right]^2$$

$$\left[ \frac{8 \cdot 274 \cdot 18 \cdot 264}{281 \cdot 282^2} + \frac{17 \cdot 59 \cdot 10 \cdot 66}{75 \cdot 76^2} + \frac{39 \cdot 122 \cdot 24 \cdot 137}{160 \cdot 161^2} + \frac{58 \cdot 32 \cdot 19 \cdot 71}{89 \cdot 90^2} \right]$$



# Age < 55, ECG +

	CHD +	CHD -	
High Cat	3	14	17
Low Cat	7	52	59
	10	66	76

$$X_{MH}^2 = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a+b) \times (c+d) \times (a+c) \times (b+d)}{(n-1) \times n^2} \right)}$$

$$\frac{\left[ \frac{1 \cdot 257 - 17 \cdot 7}{282} + \frac{3 \cdot 52 - 7 \cdot 14}{76} + \frac{9 \cdot 107 - 15 \cdot 30}{161} + \frac{14 \cdot 27 - 5 \cdot 44}{90} \right]^2}{\left[ \frac{8 \cdot 274 \cdot 18 \cdot 264}{281 \cdot 282^2} + \frac{17 \cdot 59 \cdot 10 \cdot 66}{75 \cdot 76^2} + \frac{39 \cdot 122 \cdot 24 \cdot 137}{160 \cdot 161^2} + \frac{58 \cdot 32 \cdot 19 \cdot 71}{89 \cdot 90^2} \right]}$$

# Age 55+, ECG -

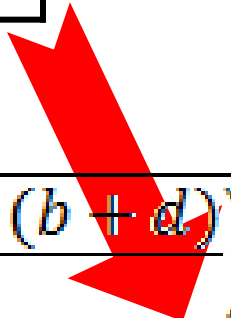
	CHD +	CHD -	
High Cat	9	30	39
Low Cat	15	107	122
	24	137	161

$$X^2_{MH} = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a+b) \times (c+d) \times (a+c) \times (b+d)}{(n-1) \times n^2} \right)}$$

$$\frac{\left[ \frac{1 \cdot 257 - 17 \cdot 7}{282} + \frac{3 \cdot 52 - 7 \cdot 14}{76} + \frac{9 \cdot 107 - 15 \cdot 30}{161} + \frac{14 \cdot 27 - 5 \cdot 44}{90} \right]^2}{\left[ \frac{8 \cdot 274 \cdot 18 \cdot 264}{281 \cdot 282^2} + \frac{17 \cdot 59 \cdot 10 \cdot 66}{75 \cdot 76^2} + \frac{39 \cdot 122 \cdot 24 \cdot 137}{160 \cdot 161^2} + \frac{58 \cdot 32 \cdot 19 \cdot 71}{89 \cdot 90^2} \right]}$$

# Age 55+, ECG +

	CHD +	CHD -	
High Cat	14	44	58
Low Cat	5	27	32
	19	71	90

$$X_{MH}^2 = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a+b) \times (c+d) \times (a+c) \times (b+d)}{(n-1) \times n^2} \right)}$$


$$\frac{\left[ \frac{1 \cdot 257 - 17 \cdot 7}{282} + \frac{3 \cdot 52 - 7 \cdot 14}{76} + \frac{9 \cdot 107 - 15 \cdot 30}{161} + \frac{14 \cdot 27 - 5 \cdot 44}{90} \right]^2}{\left[ \frac{8 \cdot 274 \cdot 18 \cdot 264}{281 \cdot 282^2} + \frac{17 \cdot 59 \cdot 10 \cdot 66}{75 \cdot 76^2} + \frac{39 \cdot 122 \cdot 24 \cdot 137}{160 \cdot 161^2} + \frac{58 \cdot 32 \cdot 19 \cdot 71}{89 \cdot 90^2} \right]}$$

# Example

$$\frac{\left[ \frac{1 \cdot 257 - 17 \cdot 7}{282} + \frac{3 \cdot 52 - 7 \cdot 14}{76} + \frac{9 \cdot 107 - 15 \cdot 30}{161} + \frac{14 \cdot 27 - 5 \cdot 44}{90} \right]^2}{\left[ \frac{8 \cdot 274 \cdot 18 \cdot 264}{281 \cdot 282^2} + \frac{17 \cdot 59 \cdot 10 \cdot 66}{75 \cdot 76^2} + \frac{39 \cdot 122 \cdot 24 \cdot 137}{160 \cdot 161^2} + \frac{58 \cdot 32 \cdot 19 \cdot 71}{89 \cdot 90^2} \right]}$$

$$= \frac{(.4894 + .7632 + 3.1863 + 1.7556)^2}{.4661 + 1.5281 + 3.7721 + 3.4731}$$

$$= 4.15 (p = .04, \text{two-sided})$$

Table 3 : Percentage point of  $\chi^2$ 

d.f.	P Value							
	0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001
1	0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83
2	1.39	2.77	4.61	5.99	7.38	9.21	10.60	13.82
3	2.37	4.11	6.25	7.81	9.35	11.34	12.84	16.27
4	3.36	5.39	7.78	9.49	11.14	13.28	14.86	18.47
5	4.35	6.58	9.24	11.07	12.83	15.09	16.75	20.52
6	5.35	7.84	10.64	12.59	14.45	16.81	18.55	22.46
7	6.35	9.04	12.02	14.07	16.01	18.48	20.28	24.32
8	7.34	10.22	13.36	15.51	17.53	20.09	21.96	26.13
9	8.34	11.39	14.68	16.92	18.47	21.67	23.59	27.88
10	9.34	12.55	15.99	18.31	20.48	23.58	25.19	29.59
11	10.34	13.70	17.28	19.68	21.92	25.73	26.76	31.26
12	11.34	14.85	18.55	21.03	23.34	27.22	28.30	32.91
13	12.34	15.98	19.81	22.36	24.74	28.70	29.69	34.53
14	13.34	17.12	21.06	23.68	26.12	30.19	31.32	36.12
15	14.34	18.25	22.31	25.00	27.49	31.59	32.80	37.70
16	15.34	19.37	23.54	26.30	28.85	32.99	34.27	39.25
17	16.34	20.49	24.77	27.59	30.19	34.37	35.72	40.79
18	17.34	21.60	25.99	28.87	31.53	35.71	37.16	42.31
19	18.34	22.72	27.20	30.14	32.85	36.19	38.58	43.82
20	19.34	23.83	28.41	31.41	34.17	37.57	39.99	45.32
21	20.34	24.93	29.62	32.67	35.48	38.93	41.40	46.80
22	21.34	26.04	30.81	33.92	36.78	40.29	42.79	48.27
23	22.34	27.14	32.01	35.17	38.08	41.64	44.18	49.73
24	23.34	28.24	33.20	36.42	39.36	42.98	45.56	51.18
25	24.34	29.34	34.38	37.65	40.65	44.31	46.93	52.63
26	25.34	30.43	35.56	38.89	41.92	45.64	48.29	54.07
27	26.34	31.53	36.74	40.11	43.19	46.96	49.64	55.51
28	27.34	32.62	37.92	41.34	44.46	48.28	50.99	56.95
29	28.34	33.71	39.09	42.56	45.72	49.59	52.34	58.39
30	29.34	34.80	40.26	43.77	46.98	50.89	53.67	59.83
40	39.34	45.62	51.81	55.76	59.34	63.69	66.77	73.40
50	49.33	56.33	63.17	67.50	71.42	76.15	79.49	85.53
60	59.33	66.98	74.40	79.08	83.30	88.38	91.95	98.00
70	69.33	77.58	85.53	90.53	95.02	100.43	104.22	112.32
80	79.33	88.13	96.58	101.88	106.63	112.33	116.32	124.84
90	89.33	98.65	107.57	113.15	118.14	124.12	128.30	137.21
100	99.33	109.14	118.50	124.34	129.56	135.81	140.17	149.45

d.f.	0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001
1	0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83
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3	2.37	4.11	6.25	7.81	9.35	11.34	12.84	16.27
4	3.36	5.39	7.78	9.49	11.14	13.28	14.86	18.47

Refer to Table 3.

Look at  $df = 1$ .

$\chi^2_{MHtest} = 4.15$ , larger than 3.84 ( $p=0.05$ ) but smaller than 5.02 ( $p=0.025$ ).

$5.02 > 4.15 > 3.84$

Therefore if  $\chi^2_{MHtest} = 4.15$ ,  $0.025 < p < 0.05$ .

# Interpretation

- There is a significant relationship between CAT and CHD, adjusted simultaneously for age and ECG ( $p < 0.05$ ;  $X^2_{MHtest}$ ).

**Important:** In the numerator, sum before squaring.

Under the null hypothesis  $X^2_{MHtest} \sim$  Chi square (1 df)

# Mantel-Haenszel Adjusted Odds Ratio

$$\widehat{OR}_{MH} = \sum_{g=1}^G \frac{a_g \cdot d_g}{n_g} / \sum_{g=1}^G \frac{b_g \cdot c_g}{n_g}$$

# Estimating The Adjusted OR

Stratum	OR	Lower	Higher
<55, ECG+	1.59	0.36	6.96
55+, ECG+	1.72	0.56	5.31
55+, ECG-	2.14	0.85	5.37
<55, ECG-	2.16	0.25	18.58
Crude OR	2.86	1.69	4.85



# Mantel-Haenszel Estimator of Common Odds Ratio

$$\hat{\theta}_{MH} = \frac{\sum \left( \frac{ad}{n} \right)}{\sum \left( \frac{bc}{n} \right)}$$

$$\widehat{OR}_{MH} = \sum_{g=1}^G \frac{a_g \cdot d_g}{n_g} / \sum_{g=1}^G \frac{b_g \cdot c_g}{n_g}$$

# Common/Average Odds Ratio

	D+	D-	
E+	a	b	a+b
E-	c	d	c+d
	a+c	b+d	n

$$\widehat{OR}_{MH} = \sum_{g=1}^G \frac{a_g \cdot d_g}{n_g} / \sum_{g=1}^G \frac{b_g \cdot c_g}{n_g}$$

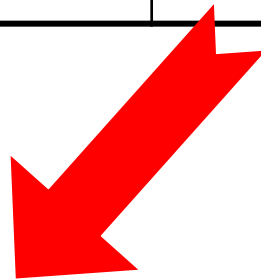
# Common/Average Odds Ratio

$$\widehat{OR}_{MH} = \sum_{g=1}^G \frac{a_g \cdot d_g}{n_g} / \sum_{g=1}^G \frac{b_g \cdot c_g}{n_g}$$

$$\begin{aligned}\widehat{OR}_{MH} &= \frac{1 \cdot 257/282 + 3 \cdot 52/76 + 9 \cdot 107/161 + 14 \cdot 27/90}{17 \cdot 7/282 + 7 \cdot 14/76 + 15 \cdot 30/161 + 5 \cdot 44/90} \\ &= 1.89\end{aligned}$$

# Age < 55, ECG -

	CHD +	CHD -	
High Cat	1	7	8
Low Cat	17	257	274
	18	264	282



$$\widehat{OR}_{MH} = \frac{1 \cdot 257/282 + 3 \cdot 52/76 + 9 \cdot 107/161 + 14 \cdot 27/90}{17 \cdot 7/282 + 7 \cdot 14/76 + 15 \cdot 30/161 + 5 \cdot 44/90}$$

$$= 1.89$$

# Age < 55, ECG +

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High Cat	3	14	17
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$$\widehat{OR}_{MH} = \frac{1 \cdot 257/282 + 3 \cdot 52/76 + 9 \cdot 107/161 + 14 \cdot 27/90}{17 \cdot 7/282 + 7 \cdot 14/76 + 15 \cdot 30/161 + 5 \cdot 44/90}$$

$$= 1.89$$

# Age 55+, ECG -

	CHD +	CHD -	
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$$= 1.89$$

# Age 55+, ECG +

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High Cat	14	44	58
Low Cat	5	27	32
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$$\widehat{OR}_{MH} = \frac{1 \cdot 257/282 + 3 \cdot 52/76 + 9 \cdot 107/161 + 14 \cdot 27/90}{17 \cdot 7/282 + 7 \cdot 14/76 + 15 \cdot 30/161 + 5 \cdot 44/90}$$

$$= 1.89$$

Conf. Interval, OR=1.89,  $X^2=4.15$

$$\widehat{OR}_{MH}^{1 \pm Z_{1-\alpha/2} / \chi_{MH}}$$

$$1.89^{1 \pm 1.96 / \sqrt{4.15}}$$

$$1.89^{1 \pm 1.96 / 2.04}$$

$$1.89^{1 \pm 0.962}$$

$$1.89^{0.038} \quad to \quad 1.89^{1.962}$$

$$(1.02, 3.49)$$



# Conclusion

- There is a significant relationship between CAT and CHD, adjusted simultaneously for age and ECG ( $p < 0.05$ ;  $X^2_{MHtest}$ ).
- The adjusted OR is 1.89 (1.02, 3.49). Since the CI did not include the value of 1, therefore it is significant.
- Those who are stressed have significantly higher 2 times risk of developing CHD compared to those not stressed, after adjusting for age and ECG changes.

# Breslow-Day Test

Azmi Mohd Tamil

# Introduction

- Breslow & Day provided a test for assessing the homogeneity of the odds ratios across many tables/stratum.
- Its derivation involves solving a quadratic equation, therefore not advisable to calculate manually.
- I used an Excel trick to bypass the need for quadratic equation.

Breslow & Day proposed a statistic (Equation 4.32) for testing the null hypothesis of homogeneity of the  $K$  true odds ratios. It sums up the squared deviations of observed and fitted values, each standardized by its variance

$$\sum_{k=1}^K \frac{(a_k - A_k(\hat{\psi}))^2}{\text{var}(a_k; \hat{\psi})},$$

where  $A_k(\hat{\psi})$  and  $\text{var}(a_k; \hat{\psi})$ , denote the expected number and the asymptotic variance of exposed cases based on the MH adjusted odds ratio  $\hat{\psi}$ , respectively.

Yep, the words doesn't make any sense at all. You will hopefully understand it once you see the calculation in action.

# Equation 4.32

$$\chi^2_{\text{Breslow-Day}} = \sum_{i=1}^{K_{\text{strata}}} \frac{[a_i - A_i(\text{using OR}_{\text{MH}})]^2}{\text{Var}(a_i; \text{null})}$$

$$\text{Var}(a_i; \text{null}) = \left( \frac{1}{A_i} + \frac{1}{B_i} + \frac{1}{C_i} + \frac{1}{D_i} \right)^{-1}$$

Breslow-Day uses the Mantel-Haenszel Odds Ratio to generate the expected tables. The most optimum would be to use conditional maximum likelihood estimator but that would need computing power.

# Step 1

- Calculate the Mantel-Haenszel adjusted Odds Ratio.

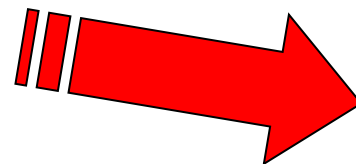
$$\widehat{OR}_{MH} = \frac{1 \cdot 257/282 + 3 \cdot 52/76 + 9 \cdot 107/161 + 14 \cdot 27/90}{17 \cdot 7/282 + 7 \cdot 14/76 + 15 \cdot 30/161 + 5 \cdot 44/90}$$
$$= 1.89$$

## Step 2

Observed Data			
Stress	CHD+	CHD-	Total
High	1	7	8
Low	17	257	274
Total	18	264	282

- MH OR=1.89. If for every stratum, the expected Odds Ratio is 1.89, what is the expected value of cell a for all tables?
- This is where you need computers to calculate for you. Shown only for 1<sup>st</sup> table.
- $1.89 = ad/bc = \frac{A \times (274-18+A)}{(8-A) \times (18-A)}$

- $A = 0.8941$



Expected Data				OR
Stress	CHD+	CHD-	Total	
High	0.8941	7.1059	8	1.890
Low	17.1059	256.8941	274	
Total	18	264	282	

# Quadratic Equation (1<sup>st</sup> Stratum)

- $ad/bc = 1.89$
- $1.89 = \frac{A \times (274 - 18 + A)}{(8 - A) \times (18 - A)}$  where

–  $a = A$

–  $b = (8 - A)$

–  $c = (18 - A)$

–  $d = 274 - c = (274 - 18 + A)$

Observed Data			
Stress	CHD+	CHD-	Total
High	1 <span style="color: red;">A</span>	7	8
Low	17	257	274
Total	18	264	282



# Quadratic Equation

- $$1.89 = \frac{A \times (274 - 18 + A)}{(8 - A) \times (18 - A)}$$

- $$1.89 = \frac{A^2 + 256A}{A^2 - 26A + 144}$$

Observed Data			
Stress	CHD+	CHD-	Total
High	1 <span style="color: red;">A</span>	7	8
Low	17	257	274
Total	18	264	282

- $$1.89A^2 - 49.14A + 272.16 = A^2 + 256A$$

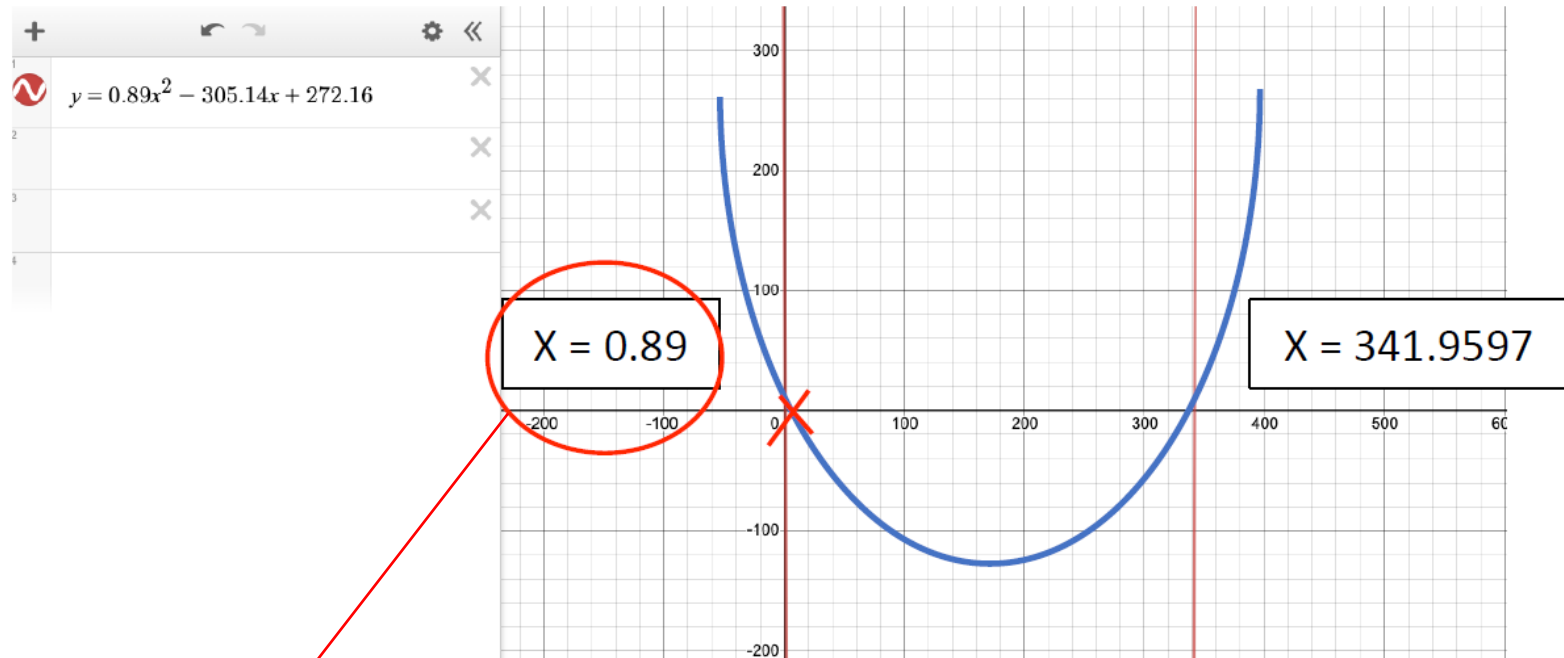
- $$1.89A^2 - A^2 - 49.14A - 256A + 272.16 = 0$$

- $$0.89A^2 - 305.14A + 272.16 = 0$$

# Quadratic Equation Using fx-570

- $0.89A^2 - 305.14A + 272.16 = 0$
- $y = 0.89x^2 - 305.14x + 272.16$
- Press Mode 3x & select EQN for equation.
- For “Unknowns”, press right to display “degree” then select 2 for quadratic equation.
- Enter 0.89 for a, -305.14 for b and 272.16 for c.
- Answer  $x_1=341.959682$ ,  $x_2=0.89425089$ .

We take  $X=0.89425$  since 341.95968 is too big for Table 1



Observed Data			
Stress	CHD+	CHD-	Total
High	1	7	8
Low	17	257	274
Total	18	264	282



Stress	CHD+	CHD-	Total	
High	0.8943	7.1057	8	1.890
Low	17.1057	256.8943	274	
Total	18	264	282	

# Step 3

- For each stratum, obtain the null hypothesis variance of the cell count.

Expected Data				OR
Stress	CHD+	CHD-	Total	
High	0.8943	7.1057	8	1.890
Low	17.1057	256.8943	274	
Total	18	264	282	

$$\text{Var}(a_i; \text{null}) = \left( \frac{1}{A_i} + \frac{1}{B_i} + \frac{1}{C_i} + \frac{1}{D_i} \right)^{-1}$$

- $\text{Var} = (1/0.8943 + 1/7.1057 + 1/17.1057 + 1/256.8943)^{-1}$   
 $= 0.75684.$

# Step 4

$$\chi^2_{\text{Breslow-Day}} = \sum_{i=1}^{K_{\text{strata}}} \frac{[a_i - A_i(\text{using } OR_{MH})]^2}{\text{Var}(a_i; \text{null})}$$

- a = observed value
- A = expected value
- $\frac{(1-0.8943)^2}{0.75684}$
- = 0.014762.
- Repeat for all tables.

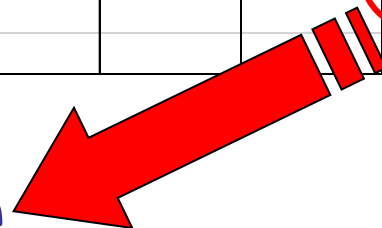
Observed Data			
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High	1	7	8
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Expected Data				OR
Stress	CHD+	CHD-	Total	
High	0.8943	7.1057	8	1.890
Low	17.1057	256.8943	274	
Total	18	264	282	

# Excel Spreadsheet

Stratum	Observed Data				OR	Expected Data				OR	A€	V€	Breslow
	Stress	CHD+	CHD-	Total		Stress	CHD+	CHD-	Total				
Young	High	1	7	8	2.16	High	0.8943	7.1057	8	1.890	0.8943	0.7568	0.014762
ECG-	Low	17	257	274		Low	17.1057	256.8943	274				
	Total	18	264	282		Total	18	264	282				
	Stress	CHD+	CHD-	Total		Stress	CHD+	CHD-	Total				
Young	High	3	14	17	1.59	High	3.309	13.691	17	1.890	3.3090	1.8388	0.051924
ECG+	Low	7	52	59		Low	6.691	52.309	59				
	Total	10	66	76		Total	10	66	76				
	Stress	CHD+	CHD-	Total		Stress	CHD+	CHD-	Total				
Old	High	9	30	39	2.14	High	8.442	30.558	39	1.890	8.4420	4.4474	0.07001
ECG-	Low	15	107	122		Low	15.558	106.442	122				
	Total	24	137	161		Total	24	137	161				
	Stress	CHD+	CHD-	Total		Stress	CHD+	CHD-	Total				
Old	High	14	44	58	1.72	High	14.284	43.716	58	1.890	14.2840	2.9276	0.02755
ECG+	Low	5	27	32		Low	4.716	27.284	32				
	Total	19	71	90		Total	19	71	90				
	Stress	CHD+	CHD-	Total									
TOTALS	High	27	95	122	2.86						26.929	9.971	0.164
	Low	44	443	487									
	Total	71	538	609									

## Breslow-Day Chi Square



## Step 5

- Sum up all the differences and check the p value from the chi square table (df = 3, since 4 stratum).
- $\chi^2_{BDTest} = 0.164$ ; (d.f.=3) therefore  $p > 0.5$ .
- Since the test of homogeneity is not significant, all the OR of the strata are homogenous.

Table 3 : Percentage point of  $\chi^2$ 

d.f.	P Value							
	0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001
1	0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83
2	1.39	2.77	4.61	5.99	7.38	9.21	10.60	13.82
3	2.37	4.11	6.25	7.81	9.35	11.34	12.84	16.27
4	3.36	5.39	7.78	9.49	11.14	13.28	14.86	18.47
5	4.35	6.58	9.24	11.07	12.83	15.09	16.75	20.52
6	5.35	7.84	10.64	12.59	14.45	16.81	18.55	22.46
7	6.35	9.04	12.02	14.07	16.01	18.48	20.28	24.32
8	7.34	10.22	13.36	15.51	17.53	20.09	21.96	26.13
9	8.34	11.39	14.68	16.92	18.48	21.67	23.59	27.88
10	9.34	12.55	15.99	18.31	20.48	23.21	25.19	29.59
11	10.34	13.70	17.28	19.68	21.92	24.73	26.76	31.26
12	11.34	14.85	18.55	21.03	23.34	26.22	28.30	32.91
13	12.34	15.98	19.81	22.36	24.74	27.69	29.69	34.53
14	13.34	17.12	21.06	23.68	26.12	29.14	31.32	36.12
15	14.34	18.25	22.31	25.00	27.49	30.58	32.80	37.70
16	15.34	19.37	23.54	26.30	28.85	32.00	34.27	39.25
17	16.34	20.49	24.77	27.59	30.19	33.41	35.72	40.79
18	17.34	21.60	25.99	28.87	31.53	34.81	37.16	42.31
19	18.34	22.72	27.20	30.14	32.85	36.19	38.58	43.82
20	19.34	23.83	28.41	31.41	34.17	37.57	40.00	45.32
21	20.34	24.93	29.62	32.67	35.48	38.93	41.41	46.80
22	21.34	26.04	30.81	33.92	36.78	40.29	42.79	48.27
23	22.34	27.14	32.01	35.17	38.08	41.64	44.18	49.73
24	23.34	28.24	33.20	36.42	39.36	42.98	45.56	51.18
25	24.34	29.34	34.38	37.65	40.65	44.31	46.93	52.63
26	25.34	30.43	35.56	38.89	41.92	45.64	48.29	54.07
27	26.34	31.53	36.74	40.11	43.19	46.96	49.64	55.51
28	27.34	32.62	37.92	41.34	44.46	48.28	50.99	56.94
29	28.34	33.71	39.09	42.56	45.72	49.59	52.34	58.37
30	29.34	34.80	40.26	43.77	46.98	50.89	53.67	59.79
40	39.34	45.62	51.81	55.76	59.34	63.69	66.77	73.40
50	49.33	56.33	63.17	67.50	71.42	76.15	79.49	85.53
60	59.33	66.98	74.40	79.08	83.30	88.38	91.95	98.43
70	69.33	77.58	85.53	90.53	95.02	100.43	104.22	112.32
80	79.33	88.13	96.58	101.88	106.63	112.33	116.32	124.84
90	89.33	98.65	107.57	113.15	118.14	124.12	128.30	137.21
100	99.33	109.14	118.50	124.34	129.56	135.81	140.17	149.45

d.f.	0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001
1	0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83
2	1.39	2.77	4.61	5.99	7.38	9.21	10.60	13.82
3	2.37	4.11	6.25	7.81	9.35	11.34	12.84	16.27
4	3.36	5.39	7.78	9.49	11.14	13.28	14.86	18.47

Refer to Table 3.

Look at  $df = 3$ .

$\chi^2_{BDtest} = 0.164$ , smaller than 2.37 ( $p=0.5$ )

$0.164 > 2.37$

Therefore if  $\chi^2_{BDtest} = 0.164$ ,  $p > 0.5$ .

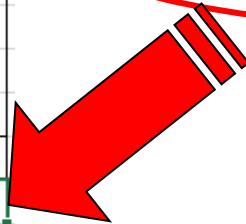


# Same result as SPSS

A€	V€	Breslow
0.8941	0.7567	0.01482
3.3090	1.8388	0.05192
8.4420	4.4474	0.07001
14.2840	2.9276	0.02755
26.929	9.971	<b>0.164</b>

## Tests of Homogeneity of the Odds Ratio

	Chi-Squared	df	Asymp. Sig. (2-sided)
Breslow-Day	.164	3	.983
Tarone's	.164	3	.983



# Tarone Adjustment

Should subtract **Tarone correction** from Breslow-Day statistic to get better chi-square approximation.

**Tarone correction =**

Thus, for a consistent estimator  $\tilde{\psi}$ , the modified heterogeneity score test statistic is

$$X^2(\tilde{\psi}) = \sum_{k=1}^K \{x_k - e_k(\tilde{\psi})\}^2 / v_k(\tilde{\psi}) - \{x_{\cdot} - e_{\cdot}(\tilde{\psi})\}^2 / v_{\cdot}(\tilde{\psi}).$$

Thus, let  $\hat{e}_k(\psi)$  be the appropriate solution to the quadratic equation

$$\frac{\hat{e}_k(n_{2k} - m_k + \hat{e}_k)}{(m_k - \hat{e}_k)(n_{1k} - \hat{e}_k)} = \psi,$$

and let

$$\hat{v}_k(\psi) = \{\hat{e}_k^{-1} + (m_k - \hat{e}_k)^{-1} + (n_{1k} - \hat{e}_k)^{-1} + (n_{2k} - m_k + \hat{e}_k)^{-1}\}^{-1}$$

# Why Tarone?

- *Tarone noted that by using the MH Odds Ratio estimator instead of the better conditional maximum likelihood estimator, the Breslow–Day test statistic becomes like the conditional likelihood score test. Since the MH estimator is inefficient, Tarone noted that the test statistic is stochastically larger than a  $\chi^2$  random variable under the homogeneity hypothesis.*
- *Tarone wrote in 1985; “this paper derives the appropriate modification of the heterogeneity score test when the parameter of interest is estimated by an inefficient, but consistent, estimator.”*

# Summary

- **CMH test** assumes common odds ratio  $\theta$  and tests if it is 1.
- **Mantel-Haenszel estimate** of the odds ratio averages numerators and denominators before taking the ratio.
- **Breslow-Day test** checks if odds ratios are indeed common using discrepancies in (observed – expected) cell counts.
- **Tarone's adjustment** claims that using MH Odds Ratio estimator for the test of homogeneity, is inefficient, therefore needs to be corrected. But the formula is all Greek to me, so I give up.

# In SPSS

- In this data, we are trying to see the relationship between CAT & CHD and see whether AGE & ECG changes are Confounders.

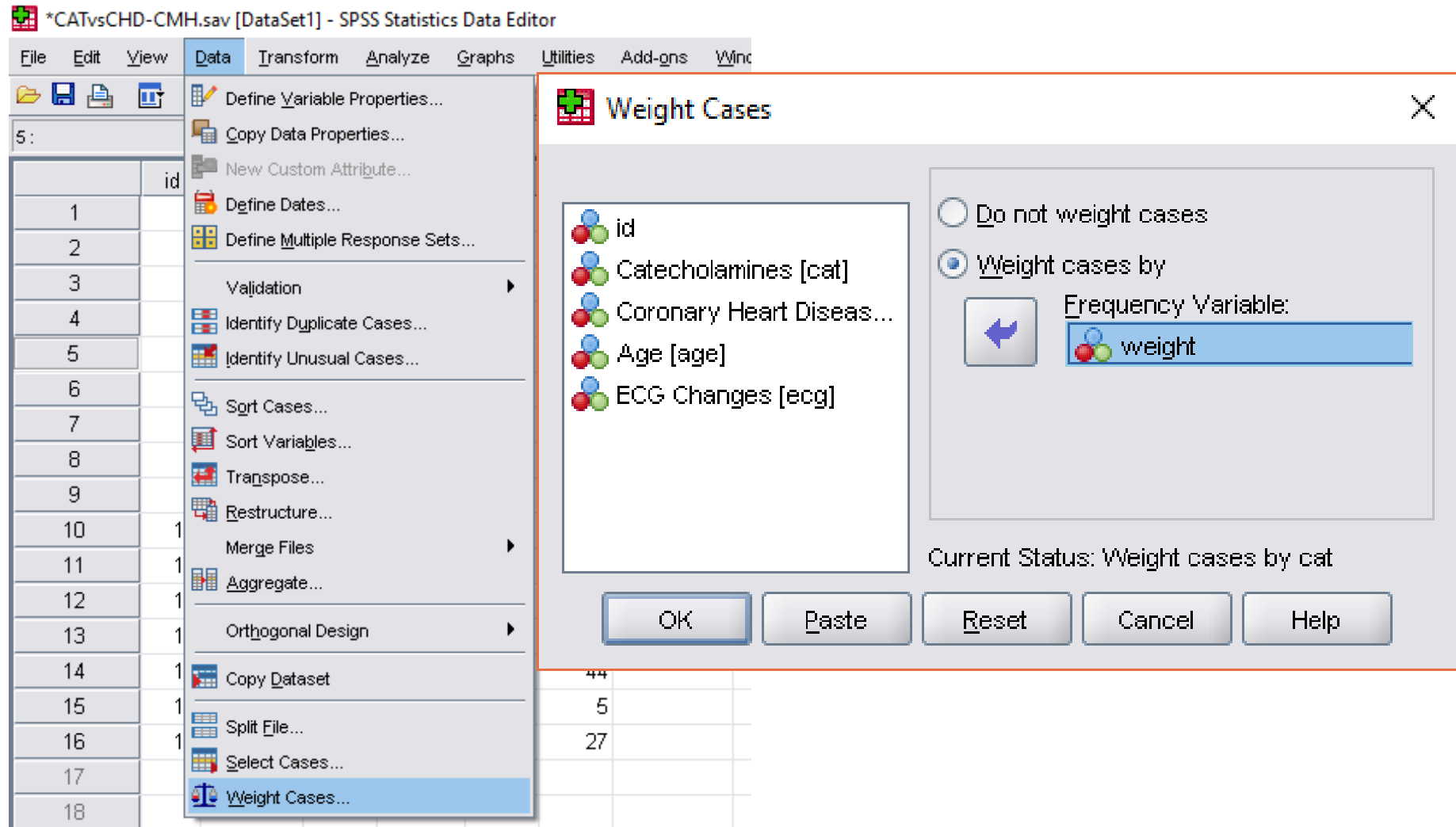
# Data For Exercise

CATvsCHD-CMH.sav [DataSet1] - SPSS Statistics Data Editor

	id	cat	chd	age	ecg	weight	v
1	1	High Cat	CHD+	Age <55	ECG-	1	
2	2	High Cat	CHD-	Age <55	ECG-	7	
3	3	Low Cat	CHD+	Age <55	ECG-	17	
4	4	Low Cat	CHD-	Age <55	ECG-	257	
5	5	High Cat	CHD+	Age <55	ECG+	3	
6	6	High Cat	CHD-	Age <55	ECG+	14	
7	7	Low Cat	CHD+	Age <55	ECG+	7	
8	8	Low Cat	CHD-	Age <55	ECG+	52	
9	9	High Cat	CHD+	Age 55+	ECG-	9	
10	10	High Cat	CHD-	Age 55+	ECG-	30	
11	11	Low Cat	CHD+	Age 55+	ECG-	15	
12	12	Low Cat	CHD-	Age 55+	ECG-	107	
13	13	High Cat	CHD+	Age 55+	ECG+	14	
14	14	High Cat	CHD-	Age 55+	ECG+	44	
15	15	Low Cat	CHD+	Age 55+	ECG+	5	
16	16	Low Cat	CHD-	Age 55+	ECG+	27	

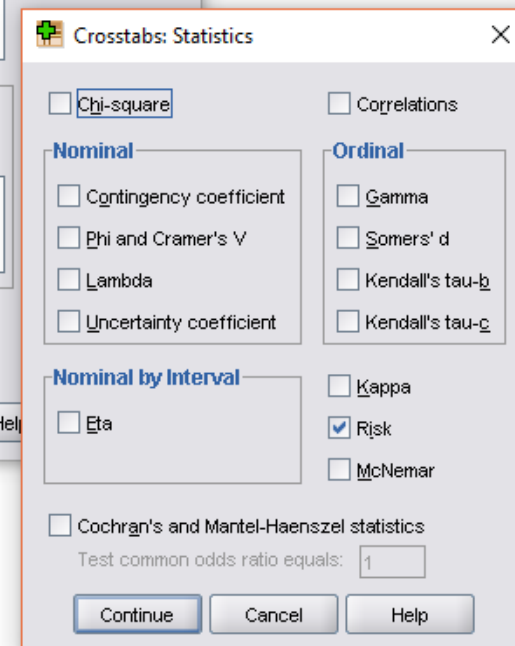
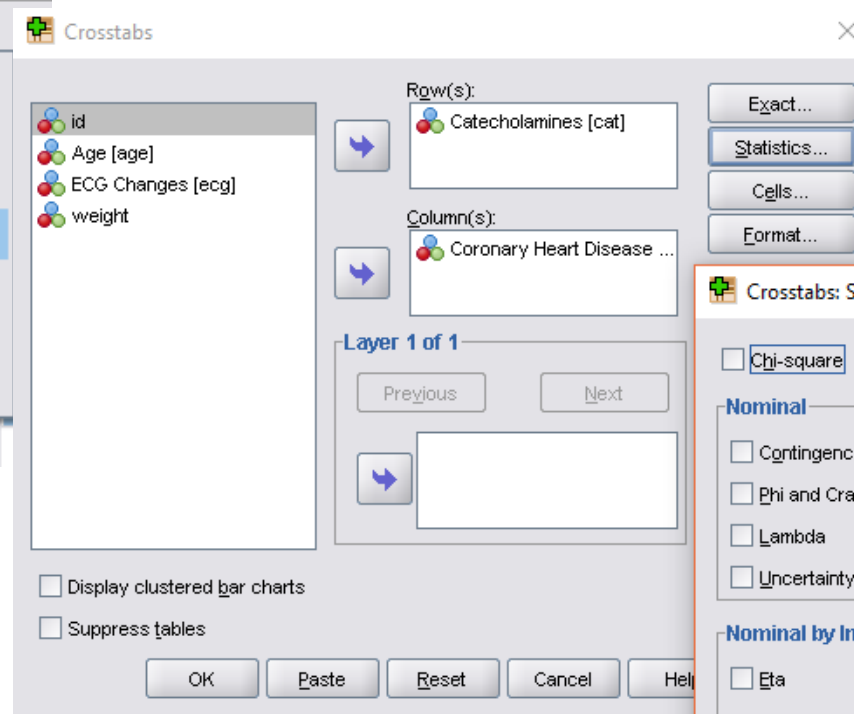
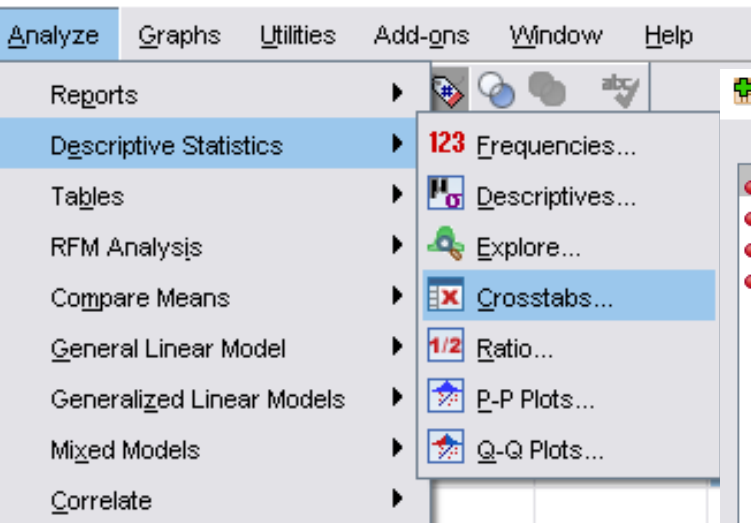
<https://wp.me/p4mYLF-81>

# Weighted Analysis



# Combined Analysis

SS Statistics Data Editor



nate		
e	95% Confidence Interval	
	Lower	Upper
61	1.688	4.851



# Combine

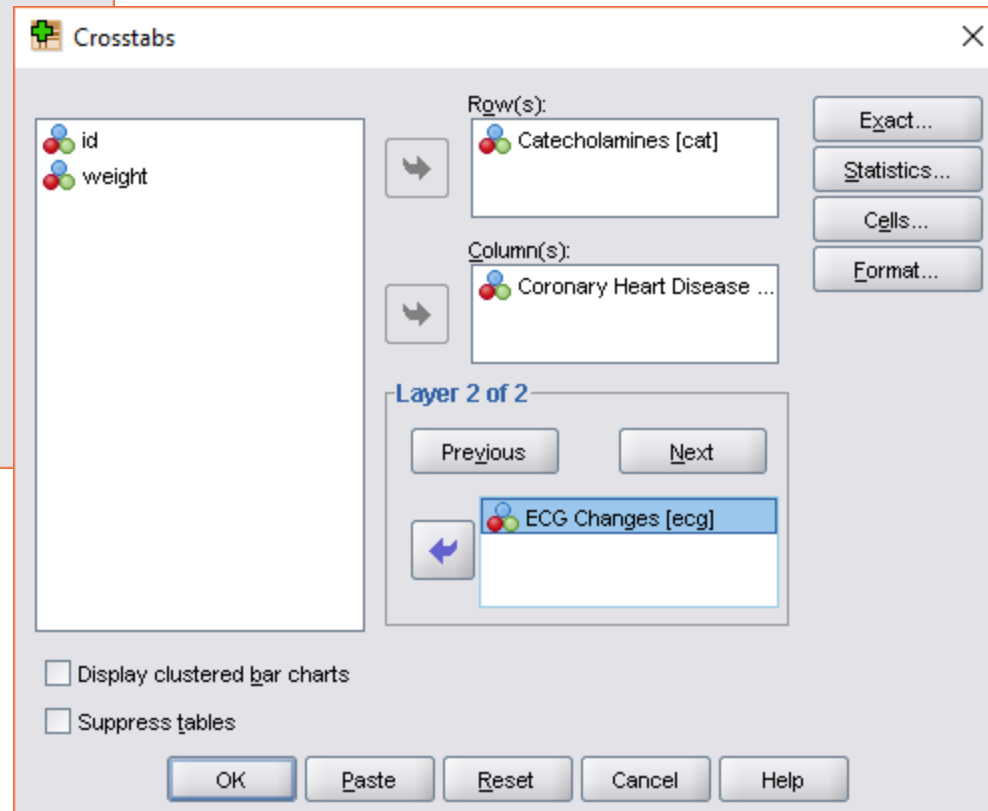
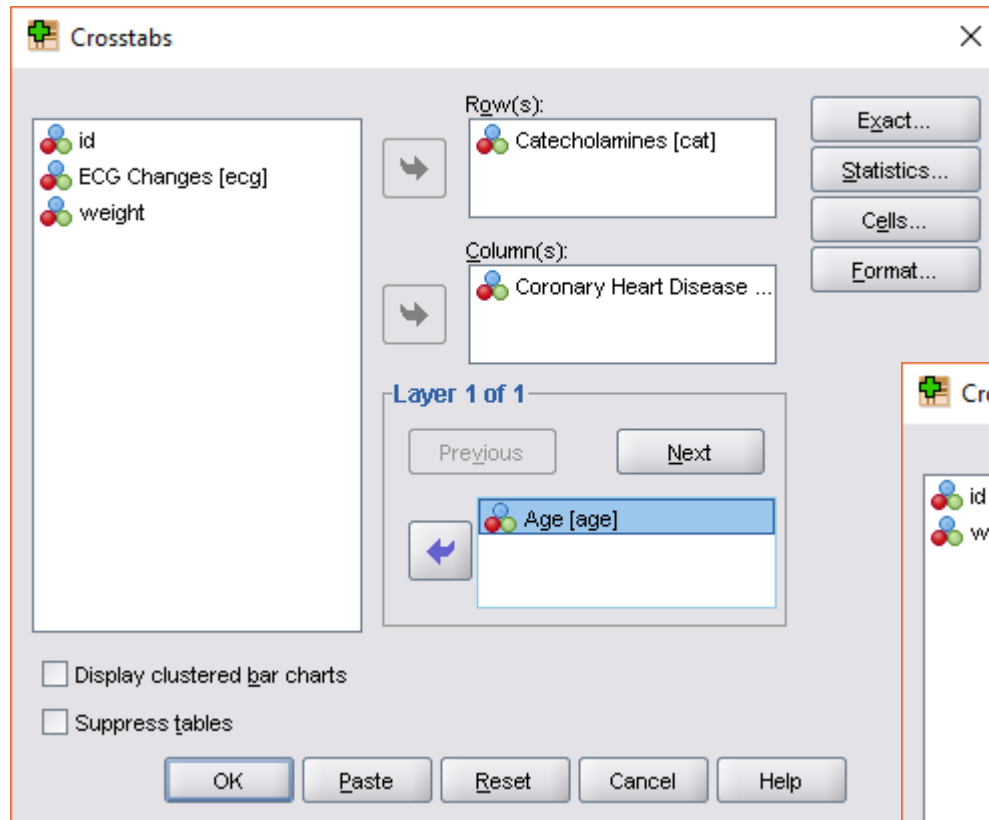
Catecholamines \* Coronary Heart Disease Crosstabulation

			Coronary Heart Disease		Total
			CHD-	CHD+	
Catecholamines	Low Cat	Count	443	44	487
		% within Catecholamines	91.0%	9.0%	100.0%
	High Cat	Count	95	27	122
		% within Catecholamines	77.9%	22.1%	100.0%
Total		Count	538	71	609
		% within Catecholamines	88.3%	11.7%	100.0%


Risk Estimate

	Value	95% Confidence Interval	
		Lower	Upper
Odds Ratio for Catecholamines (Low Cat / High Cat)	2.861	1.688	4.851

# Analyse->Descriptives->Crosstab



# Select CMH statistics

 Crosstabs: Statistics ✕

☐ Chi-square

Nominal

☐ Contingency coefficient  
☐ Phi and Cramer's V  
☐ Lambda  
☐ Uncertainty coefficient

Nominal by Interval

☐ Eta

☐ Correlations

Ordinal

☐ Gamma  
☐ Somers' d  
☐ Kendall's tau-b  
☐ Kendall's tau-c

☐ Kappa  
☐ Risk  
☐ McNemar

☒ Cochran's and Mantel-Haenszel statistics  
Test common odds ratio equals:

Continue

Cancel

Help

Catecholamines \* Coronary Heart Disease \* ECG Changes \* Age Crosstabulation

					Coronary Heart Disease			
Age	ECG Changes				CHD-	CHD+	Total	
Age <55	ECG-	Catecholamines	Low Cat	Count	257	17	274	
				% within Catecholamines	93.8%	6.2%	100.0%	
			High Cat	Count	7	1	8	
				% within Catecholamines	87.5%	12.5%	100.0%	
		Total			Count	264	18	282
					% within Catecholamines	93.6%	6.4%	100.0%
	ECG+	Catecholamines	Low Cat	Count	52	7	59	
				% within Catecholamines	88.1%	11.9%	100.0%	
			High Cat	Count	14	3	17	
				% within Catecholamines	82.4%	17.6%	100.0%	
		Total			Count	66	10	76
					% within Catecholamines	86.8%	13.2%	100.0%
Age 55+	ECG-	Catecholamines	Low Cat	Count	107	15	122	
				% within Catecholamines	87.7%	12.3%	100.0%	
			High Cat	Count	30	9	39	
				% within Catecholamines	76.9%	23.1%	100.0%	
		Total			Count	137	24	161
					% within Catecholamines	85.1%	14.9%	100.0%
	ECG+	Catecholamines	Low Cat	Count	27	5	32	
				% within Catecholamines	84.4%	15.6%	100.0%	
			High Cat	Count	44	14	58	
				% within Catecholamines	75.9%	24.1%	100.0%	
		Total			Count	71	19	90
					% within Catecholamines	78.9%	21.1%	100.0%

# Odds Ratio by Stratum

Risk Estimate

Age      ECG Changes			95% Confidence Interval	
			Lower	Upper
Age <55	ECG-	Odds Ratio for Catecholamines (Low Cat / High Cat)	2.160	.251      18.578
	ECG+	Odds Ratio for Catecholamines (Low Cat / High Cat)	1.592	.364      6.962
Age 55+	ECG-	Odds Ratio for Catecholamines (Low Cat / High Cat)	2.140	.853      5.371
	ECG+	Odds Ratio for Catecholamines (Low Cat / High Cat)	1.718	.556      5.308

Risk Estimate

	Value	95% Confidence Interval	
		Lower	Upper
Odds Ratio for Catecholamines (Low Cat / High Cat)	2.861	1.688	4.851

# Odds Ratio

Stratum	OR
<55, ECG+	1.59
55+, ECG+	1.72
55+, ECG-	2.14
<55, ECG-	2.16
Crude OR	2.86

- There seems to be little effect modification due to age and ECG. But combined table stronger & highly significant.
- Need to adjust for effect of age & ECG.

# No Interaction between Age & ECG Changes with Catecholamine Level

## Tests of Homogeneity of the Odds Ratio

	Chi-Squared	df	Asymp. Sig. (2-sided)
Breslow-Day	.164	3	.983
Tarone's	.164	3	.983

Since the test of homogeneity is not significant, all the OR of the strata are homogenous. The changing level of Age & ECG did not change CHD OR much.

Adjusted OR = 1.891, different than unadjusted OR=2.86. p value is significant, indicating OR sig. since Confidence Interval did not include 1.

**Mantel-Haenszel Common Odds Ratio Estimate**

Estimate			1.891
ln(Estimate)			.637
Std. Error of ln(Estimate)			.316
Asymp. Sig. (2-sided)			.044
Asymp. 95% Confidence Interval	Common Odds Ratio	Lower Bound	1.017
		Upper Bound	3.516
	ln(Common Odds Ratio)	Lower Bound	.017
		Upper Bound	1.257

The Mantel-Haenszel common odds ratio estimate is asymptotically normally distributed under the common odds ratio of 1.000 assumption. So is the natural log of the estimate.



# Magnitude of Confounding > 10%

- May cause an overestimate (positive confounding) or an underestimate (negative confounding).
- Can be quantified by computing the percentage difference between the crude and adjusted measures.
- If Adjusted OR = 1.891, Crude OR=2.86.
  - Epid;  $(2.86 - 1.891)/1.891 = 51.24\%$
  - Stats;  $(2.86 - 1.891)/2.86 = 33.88\%$
- % larger than 10%, therefore Age/ECG changes are positive confounding factors for CAT.

$$X^2_{MH}$$

### Tests of Conditional Independence

	Chi-Squared	df	Asymp. Sig. (2-sided)
Cochran's	4.191	1	.041
Mantel-Haenszel	3.510	1	.061

- Even after adjusting for Age & ECG changes,  $X^2_{CMH}$  is 4.19,  $p=0.041$ , therefore sig association between CAT level & CHD.

# Using SPSS $X^2_{CMH}$

$$\frac{\left[ \frac{1.257-17.7}{282} + \frac{3.52-7.14}{76} + \frac{9.107-15.30}{161} + \frac{14.27-5.44}{90} \right]^2}{\left[ \frac{8.274 \cdot 18.264}{281 \cdot 282^2} + \frac{17.59 \cdot 10.66}{75 \cdot 76^2} + \frac{39.122 \cdot 24.137}{160 \cdot 161^2} + \frac{58.32 \cdot 19.71}{89 \cdot 90^2} \right]}$$

$$= \frac{(.4894 + .7632 + 3.1863 + 1.7556)^2}{.4661 + 1.5281 + 3.7721 + 3.4731}$$

$$= 4.15 (p = .04, \text{two-sided})$$

**Tests of Conditional Independence**

	Chi-Squared	df	Asymp. Sig. (2-sided)
Cochran's	4.191	1	.041
Mantel-Haenszel	3.510	1	.061

# Using SPSS $X^2_{CMH}$

continuity correction? enter 'y' or 'n':

chi-square: 4.153  
d.f.: 1  
P-value: 0.042

stratum↓	outcome risk ↓→	CHD+	CHD-	proportion CHD+
Young, ECG-	High	1	7	0.125
	Low	17	257	0.062
Young, ECG+	High	3	14	0.176
	Low	7	52	0.119
Old, ECG-	High	9	30	0.231
	Low	15	107	0.123
Old, ECG+	High	14	44	0.241
	Low	5	27	0.156

$$X^2_{MH} = \frac{\sum \left( \frac{ad - cb}{n} \right)^2}{\sum \left( \frac{(a + b) \times (c + d) \times (a + c) \times (b + d)}{(n - 1) \times n^2} \right)}$$

## Tests of Conditional Independence

	Chi-Squared	df	Asymp. Sig. (2-sided)
Cochran's	4.191	1	.041
Mantel-Haenszel	3.510	1	.061

# Using Continuity Correction $\chi^2_{MH}$

continuity correction? enter 'y' or 'n':

chi-square: 3.51  
d.f.: 1  
P-value: 0.061

$$\chi^2_{MH} = \frac{\{|\sum[a-(a+b)(a+c)/n]|-0.5\}^2}{\sum(a+b)(a+c)(b+d)(c+d)/(n^3-n^2)}$$

stratum↓	outcome risk ↓→	CHD+	CHD-	proportion CHD+
Young, ECG-	High	1	7	0.125
	Low	17	257	0.062
Young, ECG+	High	3	14	0.176
	Low	7	52	0.119
Old, ECG-	High	9	30	0.231
	Low	15	107	0.123
Old, ECG+	High	14	44	0.241
	Low	5	27	0.156

## Tests of Conditional Independence

	Chi-Squared	df	Asymp. Sig. (2-sided)
Cochran's	4.191	1	.041
Mantel-Haenszel	3.510	1	.061

# When to use Continuity Correction?

- [https://www.statsdirect.com/help/meta\\_analysis/mh.htm](https://www.statsdirect.com/help/meta_analysis/mh.htm)
- If any cell count in any of the stratum tables is zero, then the continuity correction should be applied.
- $$\chi^2_{MH} = \frac{(|\sum(a-(a+b)(a+c)/n)|-0.5)^2}{\sum(a+b)(a+c)(b+d)(c+d)/(n^3-n^2)}$$

# Using StatCalc $\chi^2_{MH}$

	+ Disease -		
+	27	95	122
-	44	443	487
E x p o s u r e	71	538	609

Analysis of Single Table  
 Odds ratio = 2.86 (1.63 <OR< 5.01)  
 Cornfield 95% confidence limits for OR  
 Relative risk = 2.45 (1.58 <RR< 3.79)  
 Taylor Series 95% confidence limits for RR  
 Ignore relative risk if case control study.

Mantel-Haenszel test (MH)

$$\chi^2(MH) = \frac{(n-1)(ad - bc)^2}{(n_1 \times n_0 \times m_1 \times m_0)} =$$

$$= \frac{608 * ((27 * 443) - (95 * 44))^2}{(71 * 538 * 122 * 487)}$$

$$= 16.21978128$$

	Chi-Squares					P-values				
Uncorrected :						16.25	0.0000556			
Mantel-Haenszel:						16.22	0.0000564			
Yates corrected:						15.00	0.0001075			
d.k.	0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001		
1	0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83		

- [http://web1.sph.emory.edu/activepi/Instructors/Kevin\\_MSword/lesson\\_12boh.htm](http://web1.sph.emory.edu/activepi/Instructors/Kevin_MSword/lesson_12boh.htm)
- The Mantel-Haenszel Test in StatCalc is a large-sample version of Fisher's Exact Test, not the same as CMH Chi-square.

# Using StatCalc $\chi^2_{MH}$

	+ Disease -		
+	27	95	122
-	44	443	487
	71	538	609

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Mantel-Haenszel test (MH)

$$\chi^2(MH) = \frac{(n-1)(ad - bc)^2}{(n_1 \times n_0 \times m_1 \times m_0)} =$$

$$= 608 * ((27 * 443) - (95 * 44))^2 / (71 * 538 * 122 * 487)$$

$$= 16.21978128$$

Analysis of Single Table  
 Odds ratio = 2.86 (1.63 < OR < 5.01)  
 Cornfield 95% confidence limits for OR  
 Relative risk = 2.45 (1.58 < RR < 3.79)  
 Taylor Series 95% confidence limits for RR  
 Ignore relative risk if case control study.

	Chi-Squares					P-values				
Uncorrected	:	16.25				0.0000556				
Mantel-Haenszel	:	16.22				0.0000564				
Yates corrected	:	15.00				0.0001075				
d.f.		0.5	0.25	0.1	0.05	0.025	0.01	0.005	0.001	
1		0.45	1.32	2.71	3.84	5.02	6.63	7.88	10.83	

Table 17.3 Crude Analysis of CAT-CHD Data

	HI CAT	LO CAT	
CHD	27	44	71
$\overline{CHD}$	95	443	538
	122	487	609

$$c\hat{RR} = \frac{27/122}{44/487} = 2.45$$

$$\chi^2_{MH} = \frac{608[(27)(443) - (44)(95)]^2}{(122)(487)(71)(538)}$$

$$= 16.22 \quad (P < .001)$$



# Conclusion

- There is a significant relationship between CAT and CHD, adjusted simultaneously for age and ECG ( $p < 0.05$ ;  $X^2_{CMH}$ ).
- The adjusted OR is 1.89 (1.02, 3.49). Since the CI did not include the value of 1, therefore it is significant.
- Those who are stressed have significantly higher 2 times risk of developing CHD compared to those not stressed, after adjusting for age and ECG changes.

# References

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