

**Practice problems and their solutions – do NOT need to submit**

1. The table below cross-classifies a sample of Americans according to their gender and opinion about an afterlife. Does an association exist between gender and belief in an afterlife? Is one gender more likely than the other to believe in an afterlife, or is belief in an afterlife independent of gender?

	Belief in Afterlife	
	Yes	No or Undecided
Females	509	116
Males	398	104

Let  $X$  =gender and  $Y$  =belief in an afterlife.

- (a) The output below shows the results of fitting the independence log-linear model. Report and interpret the results of goodness-of-fit test.
- (b) Report  $\{\hat{\lambda}_j^Y\}$ . Interpret  $\hat{\lambda}_1^Y - \hat{\lambda}_2^Y$ .

First note that the model of independence is

$$\log \mu_{ij} = \lambda + \lambda_i^X + \lambda_j^Y$$

$$\log \mu_{ij} = \lambda + \lambda_i^{gender} + \lambda_j^{belief}$$

Here are three different outputs for the same problem, and the corresponding solutions:

- 1) Based on R, glm() function; see R code

```
Call:
glm(formula = Freq ~ gender + belief, family = poisson(), data = belief)

Deviance Residuals:
    1      2      3      4 
0.2672 -0.2995 -0.5482  0.6006 

Coefficients:
            Estimate Std. Error z value Pr(>|z|)
(Intercept)  6.22058     0.04261 146.004 < 2e-16 ***
gendermale   -0.21915     0.05993  -3.657 0.000256 ***
beliefno     -1.41651     0.07515 -18.848 < 2e-16 ***
---
Signif. codes:  0 *** 0.001 ** 0.01 * 0.05 . 0.1 1

(Dispersion parameter for poisson family taken to be 1)

    Null deviance: 463.85468  on 3  degrees of freedom
Residual deviance:  0.82242  on 1  degrees of freedom
AIC: 35.795

Number of Fisher Scoring iterations: 3
```

### solution

- "Residual deviance" gives us the deviance value,  $G^2 = 0.82242$ ,  $df = 1$  which indicates good fit. The p-value is  $1 - pchisq(0.8224, df = 1) = 0.3645$ . The model of independence fits well.

We can round off these values and report to 2 or 3 decimal places, e.g.,  $G^2 = 0.82$ ,  $df = 1$ ,  $p - value = 0.36$ .

Some extra info: for example, the log of expected counts is:

$$\log \hat{\mu}_{11=female, yes} = 6.22 + 0 + 0,$$

and thus the expected count is  $\exp(6.22058) = 502.9949$

You can get the rest of the values by running

```
>m.ind1$fitted
      1      2      3      4 
502.99468 404.00532 122.00532  97.99468
```

- Report  $\{\hat{\lambda}_j^Y\}$ . More specifically  $\hat{\lambda}_1^Y = \hat{\lambda}_{yes}^Y = 0$  and  $\hat{\lambda}_2^Y = \hat{\lambda}_{no}^Y = -1.41651$ . Then  $\hat{\lambda}_1^Y - \hat{\lambda}_2^Y = 0 - (-1.41651) = 1.41651$ .

Interpret: Given gender, estimated odds of belief in afterlife equal  $\exp(1.41651) \approx 4.1$ .

Notice that since this model of independence, odds-ratios are assumed to be equal to 1, and the odds are the same for each gender.

## 2) Based on R, loglin() function; see R code

```
$lrt
[1] 0.8224158

$pearson
[1] 0.8245764

$df
[1] 1

$margin
$margin[[1]]
[1] "gender"

$margin[[2]]
[1] "belief"

$fit
      belief
gender    yes    no
female 502.99468 122.00532
male   404.00532  97.99468

$param
$param$`(Intercept)`
[1] 5.402746

$param$gender
      female    male
0.1095758 -0.1095758

$param$belief
      yes    no
0.7082575 -0.7082575
```

## solution

- ”\$lrt” gives us the deviance value,  $G^2 = 0.82242$ , and ”\$pearson” gives the  $X^2 = 0.82458$ ,  $df = 1$ , which indicates good fit. The p-value is  $1 - pchisq(0.8224, df = 1) = 0.3645$ . The model of independence fits well.

We can round off these values and report to 2 or 3 decimal places, e.g.,  $G^2 = X^2 = 0.82$ ,  $df = 1$ ,  $p\text{-value} = 0.36$ .

Some extra info: for example, the log of expected counts is:

$$\log \hat{\mu}_{11=female,yes} = 5.403 + 0.1096 + 0.7083,$$

and thus the expected count is  $\exp(6.2209) = 502.9947$

You can get all the fitted (expected) values from the output labeled ”\$fit”; see above.

- Report  $\{\hat{\lambda}_j^Y\}$ . More specifically,  $\hat{\lambda}_1^Y = \hat{\lambda}_{yes}^Y = 0.7082575$  and  $\hat{\lambda}_2^Y = \hat{\lambda}_{no}^Y = -0.7082575$ . Then  $\hat{\lambda}_1^Y - \hat{\lambda}_2^Y = 0.7082575 - (-0.7082575) = 1.41651$ .

Interpret: Given gender, estimated odds of belief in afterlife equal  $\exp(1.41651) \approx 4.1$ .

Notice that since this model of independence, odds-ratios are assumed to be equal to 1, and the odds are the same for each gender.

## 2. 3) Based on SAS, PROC GENMOD; see SAS code

### Criteria For Assessing Goodness Of Fit

Criterion	DF	Value	Value/DF
Deviance	1	0.8224	0.8224
Scaled Deviance	1	0.8224	0.8224
Pearson Chi-Square	1	0.8246	0.8246
Scaled Pearson X2	1	0.8246	0.8246
Log Likelihood		5461.9458	

Algorithm converged.

### Analysis Of Parameter Estimates

Parameter	DF	Estimate	Standard Error	Wald 95% Confidence Limits		Chi-Square	Pr > ChiSq
Intercept	1	4.5849	0.0752	4.4376	4.7322	3720.50	<.0001
gender female	1	0.2192	0.0599	0.1017	0.3366	13.37	0.0003
gender male	0	0.0000	0.0000	0.0000	0.0000	.	.
belief yes	1	1.4165	0.0752	1.2692	1.5638	355.26	<.0001
belief no	0	0.0000	0.0000	0.0000	0.0000	.	.
Scale	0	1.0000	0.0000	1.0000	1.0000		

**solution**

- "Deviance" gives us the deviance value,  $G^2 = 0.82242$ , and "Pearson Chi-Square" gives the  $X^2 = 0.8246$ ,  $df = 1$ , which indicates good fit. The p-value is  $1 - pchisq(0.8224, df = 1) = 0.3645$ . The model of independence fits well.

We can round off these values and report to 2 or 3 decimal places, e.g.,  $G^2 = X^2 = 0.82$ ,  $df = 1$ ,  $p\text{-value} = 0.36$ .

Some extra info: for example, the log of expected counts is:

$$\log \hat{\mu}_{11=female,yes} = 4.5849 + 0.2192 + 1.4165,$$

and thus the expected count is  $\exp(6.2209) = 502.9947$

You can get all the fitted (expected) values look at the portion of the output labeled "Observation Statistics" that you get by invoking `OPTION "obstats"`: e.g.,

```
model count=gender belief /link=log dist=poisson obstats residuals
```

Values corresponding to the column label "Pred" are the expected (predicted) values, e.g., fourth value in each row out of possible 15 statistics that the SAS gives you. For example, for the first cell with gender=female and belief=yes, we observe 509 counts and the expected count is 502.99467.

The GENMOD Procedure

Observation Statistics

Observation	count	gender Resraw	belief Reschi	Pred Resdev	Xbeta StResdev	Std StReschi	HessWgt Reslik	Lower	Upper
1	509	female	yes	502.99467	6.2205796	0.0426054	502.99467	462.69793	546.80088
		6.005331	0.2677659	0.2672357	0.9062646	0.9080626	0.9079064		
2	116	female	no	122.00546	4.8040658	0.072513	122.00546	105.84152	140.63793
		-6.005459	-0.543697	-0.548251	-0.915689	-0.908082	-0.910816		
3	398	male	yes	404.00534	6.0014281	0.0469814	404.00534	368.46516	442.97353
		-6.005336	-0.298775	-0.299519	-0.910327	-0.908063	-0.908309		
4	104	male	no	97.994789	4.5849143	0.0751676	97.994789	84.570753	113.54964
		6.0052111	0.6066341	0.6005912	0.8989992	0.9080444	0.9040186		

- Report  $\{\hat{\lambda}_j^Y\}$ . More specifically,  $\hat{\lambda}_1^Y = \hat{\lambda}_{yes}^Y = 1.4165$  and  $\hat{\lambda}_2^Y = \hat{\lambda}_{no}^Y = 0$ . Then  $\hat{\lambda}_1^Y - \hat{\lambda}_2^Y = 1.4165 - 0 = 1.4165$ .

Interpret: Given gender, estimated odds of belief in afterlife equal  $\exp(1.41651) \approx 4.1$ .

Notice that since this model of independence, odds-ratios are assumed to be equal to 1, and the odds are the same for each gender.