Loglinear Models and Other Approaches

• Many tests for contingency tables use the "Pearson's Chisquare Statistic":

• An alternative approach uses the "Likelihood Ratio Chisquare Statistic":

• The LR statistic also has an asymptotic χ^2 distribution, with the same degrees of freedom as Pearson's statistic.

• An advantage of the Pearson test statistic is that its asymptotic χ^2 distribution tends to be valid with smaller sample sizes (i.e., when ______) than the χ^2 approximation for the LR statistic (which holds well when _____).

Loglinear Models

• This is a common method of analyzing contingency tables of more than two dimensions.

• In a 2 × 2 table, the null hypothesis of independence between dimensions is equivalent to

where $\pi_{i+} =$

and $\pi_{+j} =$

• Taking logarithms of both sides, we get:

which is a _____ model.

<u>Recall</u>: Our expected cell count under independence is

where $n_{i+} =$

and $n_{+j} =$

• Thus for a 2 × 2 table,

and so we have

• This fraction

is called the <u>odds ratio</u>.

It is defined as

• Now, if we instead have <u>dependence</u> between dimensions, that implies:

• Writing the loglinear model in terms of the cell counts rather than cell probabilities, we have:

under independence

under dependence

• These model parameters are estimated using software via iterative methods.

• Using the estimates, we can get fitted values for each cell.

• We then use either the Pearson statistic or the LR statistic to determine (with a χ^2 test) whether the model provides a good fit. H₀:

Three-Way Tables

• This is most useful in cases where the data are classified according to three categorical variables.

Example 1 ($2 \times 2 \times 2$ table):

Possible loglinear models for $2 \times 2 \times 2$ tables:

Example 1: Let i = 1, 2 be the level of Cigarette Use (Yes/No); let j = 1, 2 be the level of Marijuana Use; let k = 1, 2 be the level of Alcohol Use.

• The model that includes all possible parameters is called the _____ model.

• The loglm function in the MASS library in R estimates the parameters of any of these models, calculates the fitted values, and performs the χ^2 tests for fit.

• In addition, the step function evaluates these possible models based on Akaike's Information Criterion (AIC).

Example 1 Possible Questions of Interest:
Do the odds of a cigarette smoker using marijuana differ from the odds of a cigarette non-smoker using marijuana? →

• Does the value of this odds ratio depend on alcohol use? \rightarrow

<u>Analysis in R</u>: • The best model appears to be

• Example of fitted value calculation using estimated coefficients:

• Interpretation of results is best done using odds ratios:

Example 2 ($2 \times 2 \times 2$ table):

Example 2 Possible Questions of Interest:

• Do the odds of an early plant surviving differ from the odds of a late plant surviving? \rightarrow

• Does the value of this odds ratio depend on the cutting length? \rightarrow

<u>Analysis in R</u>: • The search for the best model:

• Interpretation of results via odds ratios:

Example 3 ($2 \times 2 \times 6$ table): A study classified UC-Berkeley graduate school applicants according to Admission Status (Admitted/Rejected), Sex (Male/Female), and Department (A/B/C/D/E/F). We adapt a built-in R data set.

Example 3 Possible Questions of Interest:
Do the odds of a female being admitted differ from the odds of a male being admitted? →

• Does the value of this odds ratio depend on the department to which the applicant applies? \rightarrow

<u>Analysis in R</u>: • The search for the best model: • Interpretation of results via odds ratios:

• This example illustrates something similar to what is known as <u>Simpson's Paradox</u>:

• Simpson's Paradox occurs when an association between two categorical variables is evident when the data are <u>aggregated</u> over some third categorical variable, but this association <u>is</u> <u>reversed</u> when the data are examined separately at each category of the third variable.

• In the Berkeley data, the aggregated data indicate that males are more likely to be admitted than females.

• But within each department, females are roughly as likely (or more likely) to be admitted as males.

Another example (Accident victim data):

Aggregated Data:

• Based on this, helicopter transports yield a 32% death rate, while road transports yield a 24% death rate. Which mode of transportation is better?

Separated Data:

• For serious accidents: helicopter transports yield a 48% death rate, while road transports yield a 60% death rate.

• For less serious accidents: helicopter transports yield a 16% death rate, while road transports yield a 20% death rate.

Which mode of transportation is better?

• In the aggregated data set, "seriousness of injury" is a <u>lurking variable</u>, which can conceal the actual association.