

## AIU FOR 6520

### Statistical Research Design & Methods in Forensic Psychology

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[http://www.stat.ucla.edu/~dinov/courses\\_students.html](http://www.stat.ucla.edu/~dinov/courses_students.html)

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### Sensitivity vs. Specificity

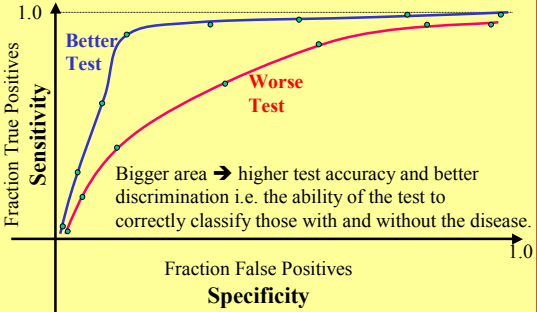
- **Sensitivity** is a measure of the fraction of gold standard known examples that are correctly classified/identified.
- **Sensitivity** =  $TP / (TP + FN)$
- **Specificity** is a measure of the fraction of negative examples that are correctly classified:  $H_0$ : no effects ( $\mu=0$ )
- **Specificity** =  $TN / (TN + FP)$
- TP = True Positives
- FN = False Negatives
- TN = True Negatives
- FP = False Positives

		True Reality	
		H <sub>0</sub> true	H <sub>0</sub> false
Test Results	Can't reject	TN	FN
	Reject H <sub>0</sub>	FP	TP

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### The ROC Curve

- Receiver Operating Characteristic (ROC) curve



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### Receiver-Operating Characteristic curve

- ROC curve demonstrates several things:
  - It shows the tradeoff between sensitivity and specificity (any increase in sensitivity will be accompanied by a decrease in specificity).
  - The closer the curve follows the left border and then the top border of the ROC space, the more accurate the test.
  - The closer the curve comes to the 45-degree diagonal of the ROC space, the less accurate the test.
  - The slope of the tangent line at a cut-point gives the likelihood ratio (LR) for that value of the test. You can check this out on the graph above.
  - The area under the curve is a measure of test accuracy.

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### Continue with ...

- CLT – EstimatesSamplingDistrX\_bar.ppt
- ChiSquare\_Tests.ppt
- MultipleLinearRegression.ppt
- Problems: C:\Ivo.dir\UCLA\_Classes\2003\Winter\FOR6530\TestBank\_StatPsych\_files\ch22\_NonParamTests.doc

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### Chi-Square $\chi^2$ Test & Applications

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### Chi-Square $\chi^2$ Test & Applications

- Nature of the chi-square distribution:  
 $X^2 = Y_1^2 + Y_2^2 + \dots + Y_n^2$ ; where  $Y_k \sim N(0,1)$
- Apply the chi-square distribution to:
  - Goodness-of-fit tests
  - Tests of independence between 2 variables
  - Tests comparing proportions from multiple populations
  - Tests of a single population variance.

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### Key Terms

- Observed versus expected frequencies
- Number of parameters (for the target model distribution) to be estimated,  $m$
- Number of categories used,  $k$
- Contingency table
- Independent variables

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### 1-dimensional tables – classify $n$ -individuals in $J$ -categories

Qualitative (factors), class variables define class/group membership (marital-status, blood-type, etc.)

Frequency tables can be used to Summarize discrete/qualitative var's.

Probability	$p_1$	$p_2$	$\dots$	$p_j$	$\dots$	$p_J$
Observed count	$O_1$	$O_2$	$\dots$	$O_j$	$\dots$	$O_J$
Expected count	$E_1$	$E_2$	$\dots$	$E_j$	$\dots$	$E_J$

$E_j = n p_j$

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### Goodness-of-Fit Tests

- The Question:
  - Does the distribution of sample data resemble a specified probability distribution, such as:
    - Binomial, HyperGeom, or Poisson discrete distributions.
    - Uniform, Normal, or Exponential continuous distributions.
    - Another probability distribution (perhaps data-driven)?
- Hypotheses:
 
$$\sum p_i = 1$$
  - $H_0$ :  $p_i$  = values expected  $H_1$ :  $p_i \neq$  values expected

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### Goodness-of-Fit Tests

- Rejection Region:
  - Degrees of Freedom =  $k - 1 - m$ 
    - where  $k$  = # of categories,  $m$  = # of parameters
  - Uniform Discrete:  $m = 0$  so  $df = k - 1$
  - Binomial:  $m = 0$  when  $p$  is known, so  $df = k - 1$   
 $m = 1$  when  $p$  is unknown, so  $df = k - 2$
  - Poisson:  $m = 1$  since  $\mu$  is estimated,  $df = k - 2$
  - Normal:  $m = 2$  when  $\mu$  and  $\sigma$  estimated,  $df = k - 3$
  - Exponential:  $m = 1$  since  $\mu$  is estimated,  $df = k - 2$

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### Goodness-of-Fit Tests

- Test Statistic:
 
$$\chi^2 = \sum_{j=1}^k \frac{(O_j - E_j)^2}{E_j}$$

where

$O_j$  = Actual number **observed** in each class

$E_j$  = Expected number,  $p_j \cdot n$

**Expected cell count = Total  $\times$  specified cell probability**

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### Goodness-of-Fit: An Example

- Problem:** In a study of vehicle ownership, it has been found that 13.5% of U.S. households do not own a vehicle, with 33.7% owning 1 vehicle, 33.5% owning 2 vehicles, and 19.3% owning 3 or more vehicles. The data for a random sample of 100 households in a resort community are summarized below. At the 0.05 level of significance, can we reject the possibility that the vehicle-ownership distribution in this community differs from that of the nation as a whole?

# Vehicles Owned	# Households
0	20
1	35
2	23
3 or more	22

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### Goodness-of-Fit: An Example

# Vehicles	$O_i$	$E_i$	$(O_i - E_i)^2 / E_i$
0	20	13.5	3.1296
1	35	33.7	0.0501
2	23	33.5	3.2910
3+22	19.3		0.3777
<b>Sum =</b>			<b>6.8484</b>

- H<sub>0</sub>:**  $p_0 = 0.135, p_1 = 0.337, p_2 = 0.335, p_{3+} = 0.193$

Vehicle-ownership distribution in this community is the same as it is in the nation as a whole.

**H<sub>1</sub>:** At least one of the proportions does not equal the stated value. Vehicle-ownership distribution in this community is not the same as it is in the nation as a whole.

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### Goodness-of-Fit: An Example

#### II. Rejection Region:

$$\alpha = 0.05$$

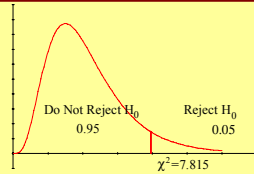
$$df = k - 1 - m = 4 - 1 - 0 = 3$$

#### III. Test Statistic:

$$\chi^2 = 6.8484$$

**IV. Conclusion:** Since the test statistic of  $\chi^2 = 6.8484$  falls below the critical value of  $\chi^2 = 7.815$ , we do not reject  $H_0$  with at least 95% confidence.

**V. Implications:** There is not enough evidence to show that vehicle ownership in this community differs from that in the nation as a whole.



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### $\chi^2$ Tests of Independence Between 2 Variables

#### The Question:

Are the two variables independent? If the two variables of interest are independent →

- The distribution of elements of one variable across the various levels does not affect how elements are distributed across the levels of the other variable.
- the probability of an element falling in any level of the second variable is unaffected by knowing its level on the first dimension.

	Y <sub>1</sub>	Y <sub>2</sub>	Y <sub>3</sub>
X <sub>1</sub>			
X <sub>2</sub>			
X <sub>3</sub>			
X <sub>4</sub>			

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### An Integrated Definition of Independence

- From basic probability:

If two events are **independent**

$$P(A \text{ and } B) = P(A) \cdot P(B)$$

$\chi^2$  Test of Independence:

If two variables are **independent**

$$P(\text{row}_i \text{ and } \text{column}_j) = P(\text{row}_i) \cdot P(\text{column}_j)$$

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### Chi-Square Tests of Independence

#### Hypotheses:

- H<sub>0</sub>:** The two variables are independent.
- H<sub>1</sub>:** The two variables are not independent.

#### Rejection Region:

- Degrees of freedom =  $(r - 1)(k - 1)$

#### Test Statistic:

$$\chi^2 = \sum_{i=1}^r \sum_{j=1}^k \frac{(O_{i,j} - E_{i,j})^2}{E_{i,j}}$$

	Y <sub>1</sub>	Y <sub>2</sub>	.....	Y <sub>k</sub>
X <sub>1</sub>				
⋮				
X <sub>r</sub>				

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### Chi-Square Tests of Independence

- Calculating expected values

$$E_{ij} = P(\text{row}_i \text{ and column}_j) \cdot n = P(\text{row}_i) \cdot P(\text{column}_j) \cdot n$$

$$= \frac{\# \text{ elements in row}_i}{n} \cdot \frac{\# \text{ elements in column}_j}{n} \cdot n$$

Canceling two factors of  $n$ ,

$$E_{ij} = \frac{(\# \text{ elements in row}_i) \cdot (\# \text{ elements in column}_j)}{n}$$

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### Chi-Square Tests of Independence

**An Example**, Researchers in a California community have asked a sample of 175 automobile owners to select their favorite from three popular automotive magazines. Of the 111 import owners in the sample, 54 selected *Car and Driver*, 25 selected *Motor Trend*, and 32 selected *Road & Track*.

Of the 64 domestic-make owners in the sample, 19 selected *Car and Driver*, 22 selected *Motor Trend*, and 23 selected *Road & Track*. At the 0.05 level, is import/domestic ownership independent of magazine preference? What is the most accurate statement that can be made about the  $p$ -value for the test?

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### Chi-Square Tests of Independence

- First, arrange the data in a table.

	<i>Car and Driver (1)</i>	<i>Motor Trend (2)</i>	<i>Road &amp; Track (3)</i>	
<b>Totals</b>				
Import (Imp)	54	25	32	<b>111</b>
Domestic (Dom)	<u>19</u>	<u>22</u>	<u>23</u>	<b>64</b>
<b>Totals</b>	<b>73</b>	<b>47</b>	<b>55</b>	<b>175</b>

- Second, compute the expected values and contributions to  $\chi^2$  for each of the six cells.
- Then to the hypothesis test ....

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### Chi-Square Tests of Independence

	<i>Car and Driver (1)</i>	<i>Motor Trend (2)</i>	<i>Road &amp; Track (3)</i>
Import (Imp):	O - 54	25	32
E -	46.3029	29.8114	34.8857
$\chi^2$ contribution -	1.2795	0.7765	0.2387
Domestic (Dom):	O - 19	22	23
E -	26.6971	17.1886	20.1143
$\chi^2$ contribution -	2.2192	1.3468	0.4140

$\Sigma \chi^2 \text{ contributions} = 6.2747$

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### Chi-Square Tests of Independence

- I. Hypotheses:

$H_0$ : Type of magazine and auto ownership are independent.

$H_1$ : Type of magazine and auto ownership are not independent.

- II. Rejection Region:

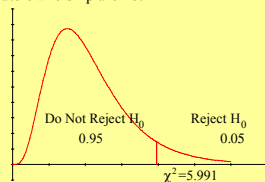
$$\alpha = 0.05$$

$$df = (r - 1)(k - 1)$$

$$= (2 - 1)(3 - 1)$$

$$= 1 \cdot 2 = 2$$

If  $\chi^2 > 5.991$ , reject  $H_0$ .



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### Chi-Square Tests of Independence

- III. Test Statistic:

$$\chi^2 = 6.2747$$

- IV. Conclusion:

Since the test statistic of 6.2747 falls beyond the critical value of 5.991, we reject the null hypothesis with at least 95% confidence.

- V. Implications:

There is enough evidence to show that magazine preference is not independent from import/domestic auto ownership.

- $p$ -value: In a cell on a Microsoft Excel spreadsheet, type: =CHIDIST(6.2747,2). The answer is:  **$p$ -value = 0.043398**

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