

7. **Birds in the trees** Researchers studied the behavior of birds that were searching for seeds and insects in an Oregon forest. In this forest, 54% of the trees were Douglas firs, 40% were ponderosa pines, and 6% were other types of trees. At a randomly selected time during the day, the researchers observed 156 red-breasted nuthatches: 70 were seen in Douglas firs, 79 in ponderosa pines, and 7 in other types of trees.<sup>2</sup> Do these data suggest that nuthatches prefer particular types of trees when they're searching for seeds and insects? Carry out a chi-square goodness-of-fit test to help answer this question.

9. **No chi-square** A school's principal wants to know if students spend about the same amount of time on homework each night of the week. She asks a random sample of 50 students to keep track of their homework time for a week. The following table displays the average amount of time (in minutes) students reported per night:

Night:	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
Average time:	130	108	115	104	99	37	62

Explain carefully why it would not be appropriate to perform a chi-square goodness-of-fit test using these data.

$\chi^2$  is not appropriate because the data collected is NOT counts but average amount of time spent on HW.

17. **Mendel and the peas** Gregor Mendel (1822–1884), an Austrian monk, is considered the father of genetics. Mendel studied the inheritance of various traits in pea plants. One such trait is whether the pea is smooth or wrinkled. Mendel predicted a ratio of 3 smooth peas for every 1 wrinkled pea. In one experiment, he observed 423 smooth and 133 wrinkled peas. The data were produced in such a way that the Random and Independent conditions are met. Carry out a chi-square goodness-of-fit test based on Mendel's prediction. What do you conclude?

11. **Benford's law** Faked numbers in tax returns, invoices, or expense account claims often display patterns that aren't present in legitimate records. Some patterns are obvious and easily avoided by a clever crook. Others are more subtle. It is a striking fact that the first digits of numbers in legitimate records often follow a model known as Benford's law.<sup>3</sup> Call the first digit of a randomly chosen record  $X$  for short. Benford's law gives this probability model for  $X$  (note that a first digit can't be 0):

USE CALC ↓

First digit ( $X$ ):	1	2	3	4	5	6	7	8	9
Probability:	0.301	0.176	0.125	0.097	0.079	0.067	0.058	0.051	0.046

A forensic accountant who is familiar with Benford's law inspects a random sample of 250 invoices from a company that is accused of committing fraud. The table below displays the sample data.

EXPECTED %

First digit:	1	2	3	4	5	6	7	8	9
Count:	61	50	43	34	25	16	7	8	6

- (a) Are these data inconsistent with Benford's law? Carry out an appropriate test at the  $\alpha = 0.05$  level to support your answer. If you find a significant result, perform a follow-up analysis.
- (b) Describe a Type I error and a Type II error in this setting, and give a possible consequence of each. Which do you think is more serious?

$L3 = L1 * 250$

12.1B

7

USE  $\chi^2$  or do by hand

TREES IN FOREST	%	BIRDS OBSERVED	EXPECTED #	$\frac{(O-E)^2}{E}$
DOUGLAS FIRS	.54	70	84.24	2.4071
PINES	.40	79	62.40	4.416
OTHER TYPES	.06	7	9.36	0.595
	1.00	156	156	$\Sigma 7.418 = \chi^2$

TEST:  $\chi^2$  GOODNESS OF FIT TEST For  $\alpha = .05$

Hypothesis  $P_E$  = true proportion of trees in forest

$H_0: P_{Firs} = .54 \quad P_{Pines} = .40 \quad P_{Other} = .06$

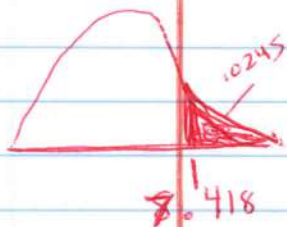
$H_A$ : At least one of the  $P_E$ 's is incorrect

CONDITIONS

Random - a random sample was used

Independent - reasonable  $156/10 = 1,560$   
red breasted nut hatches

large sample size - The expected counts in each category was greater than 5 (84.24, 62.4, 9.36)



MECHANICS  $\chi^2 = 7.418 \quad df = 2$

pvalue  $\rightarrow P(\chi^2 \geq 7.418) = \chi^2cdf(7.418, \infty, 2) = .0245$

Conclude: Since the pvalue (.0245)  $< .05$ , We Reject  $H_0$ , and conclude these birds prefer particular types of trees when they are searching for food.



(9) See handout

(11)  $P_{digit}$  = true proportion of Benford's law digit

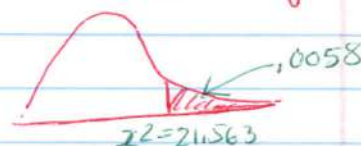
$$H_0: P_1 = .301 \quad P_3 = .125 \quad P_5 = .079 \quad P_7 = .058 \quad P_9 = .046$$

$$P_2 = .176 \quad P_4 = .097 \quad P_6 = .067 \quad P_8 = .051$$

$H_A$ : at least one of the  $P_{digits}$  is incorrect

STATE TEST: CHI SQUARE ( $\chi^2$ ) Goodness of fit test  
 $\alpha = .05$

CONDITIONS



Random - random sample of 250 invoices

Independent - reasonable they are 10(250) = 2500 invoices at the company  
large sample size - The expected counts are at least 5:

Must Give  
all expected  
counts and round  
2 decimals

75.25, 44, 31.25, 24.25, 19.75, 16.75, 14.50, 12.75, 11.5

MECHANICS:

$$\chi^2 = \sum \frac{(\text{observed} - \text{expected})^2}{\text{expected}} = \frac{(61 - 75.25)^2}{75.25} + \dots + \frac{(6 - 11.5)^2}{11.5}$$

Can show 1st + last

$$\chi^2 = 21.563 \quad df = 8$$

$$p\text{-value} = P(\chi^2 \geq 21.563) = \chi^2_{cdf}(21.563, 8) = .0058$$

CONCLUDE: Since the p-value is less than .05, we reject  $H_0$  and conclude that the invoices are inconsistent with Benford's Law

#11 cont

(A)

Follow up

ANALYSIS:DIGITOBSERVEDEXPECTED $\chi^2$ 

1

61

75.25

2.7

2

50

44.00

0.8

3

43

&gt;

31.25

4.4 \*

4

34

&gt;

24.25

3.9 \*

5

25

19.75

1.4

6

16

16.75

0.03

7

7

&lt;

14.50

3.9 \*

8

8

12.75

1.8

9

6

11.5

2.6

Reviewing  $\chi^2$   
contribution-

3, 4, 7 have the

largest contribution,

Digits 3+4 have

too many and

Digit 7 has

not enough.

(11B)

TYPE I ERROR: SAYS THAT THE COMPANY'S INVOICES  
DID NOT FOLLOW BENFORD'S LAW  
(SUGGESTING FRAUD) WHEN IN FACT  
THEY WERE CONSISTENT WITH  
BENFORD'S LAW.

TYPE II ERROR: SAYS THAT THE INVOICES WERE  
CONSISTENT WITH BENFORD'S LAW  
(SUGGESTING FRAUD) WHEN IN FACT  
THEY WERE NOT.

A TYPE I ERROR WOULD BE MORE SERIOUS HERE,  
ALL EGING THAT THE COMPANY HAD COMMITTED  
FRAUD WHEN IT HAD NOT

17

TEST:  $\chi^2$  goodness-of-fit test  $\alpha = .05$

$$H_0: P_{\text{smooth}} = .75 \quad P_{\text{wrinkled}} = .25$$

$H_a$ : AT LEAST ONE OF THE  $P_i$ 'S IS INCORRECT.

### CONDITIONS

Random and Independent Conditions were given

Large enough sample size -

The expected counts 417 and 139 are both greater than 5.

PEAS	%	OBS	EXPECTED	$\frac{(O-E)^2}{E}$
SMOOTH	.75	423	417	.0863
WRINKLED	.25	133	139	.2589
	1.00	n=556	556	.3452

### Mechanics

$$\chi^2 = .352 \quad df = 1$$

$$P\text{VALUE} = P(\chi^2 \geq .352) = \chi^2cdf(.3452, \infty, 1) = .5568$$

### Conclude:

Since the pvalue is very large and greater than .05, we fail to reject  $H_0$ . We do not have enough evidence to dispute Mendel's belief.