

Up until now  $\rightarrow$  asymptotic inference

2/8/22

$\Rightarrow$  Requires large samples

$\rightarrow$  CLT

$\rightarrow$  approximate CIs & p-values

R: prop.test

using normal approximation

- One Sample  $\times$  1 binary variable  $\rightarrow$  exact binomial inference (p-value)  
R: binom.test

Exact inference for 2 proportions (2 binary variables):

① Fisher's Exact Test

② Randomization (simulation-based) tests \*Not in book

## Fisher's Exact Test

Example: Penguins -

Scope of Inference  $\rightarrow$  ① Cause-&math\rightarrow-effect ?



Randomized  
Experiment

Observational  
Study

Yes

② To whom can we  
generalize?

Representative sample  
of what population?

- Only generalize to penguins  
Similar to those in the sample

Data:

	Survive	Not	
Metal	3	7	10
Not metal	6	4	10
	9	11	20

Row totals  
fixed  
 $\rightarrow$   
"binomial"  
Sampling

Consider count in 1<sup>st</sup> cell:  $n_{11} = 3$

$H_0$ : No association between survival status - whether the penguin had a metal band.

$$\pi_1 = P(\text{survive} \mid \text{metal band})$$

$$\pi_2 = P(\text{survive} \mid \text{no metal band})$$

$$\text{Odds ratio} = \theta = \frac{\pi_1 / (1 - \pi_1)}{\pi_2 / (1 - \pi_2)}$$

$$H_0: \theta = 1$$

$$H_a: \theta < 1$$

Under  $H_0 \Rightarrow$  Model  $n_{11}$  with a hypergeometric distribution!

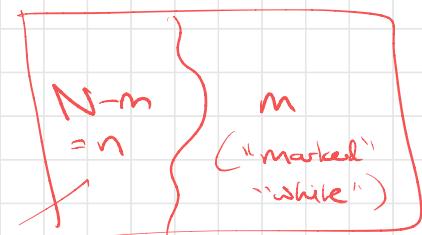
Scenario: Finite population of  $N$  items.

Parameters:

$m$  = # marked in pop.

$n$  = # unmarked in pop.

$k$  = sample size



"unmarked"  
"black"

- Sample  $k$  items  
without replacement.

Note: Sampling with replacement.

$$X \sim \text{Bin}(k, \frac{m}{m+n})$$

$X$  = # of marked items in the sample

	Success	Failure	
Group 1	$n_{11}$	$n_{12}$	$n_{1+}$
Group 2	$n_{21}$	$n_{22}$	$n_{2+}$
	$n_{+1}$	$n_{+2}$	$n$

Assumptions  $H_0$ : No association -  $\rightarrow n_{+1}$  marked  
 $n_{+2}$  unmarked

$\rightarrow \mathbb{X} = \# \text{ of marked items that end up in our sample.}$

$$P(\mathbb{X} = x) = \frac{\text{\# of samples where } x \text{ marked} \approx k-x \text{ unmarked}}{\text{total \# of possible samples}}$$

$$= \frac{\binom{m}{x} \binom{n}{k-x}}{\binom{m+n}{k}} = \frac{\binom{n_1}{n_1} \binom{n_2}{n_2}}{\binom{n}{n_1+n_2}}$$

R: dhyper(x, m, n, k)

dhyperr( $n_{11}$ ,  $n_{+1}$ ,  $n_{+2}$ ,  $n_{1+}$ )

$$\text{P-value} = P(\mathbb{X} \leq 3) \quad \text{row 1 total}$$

R: phyper(3, 9, 11, 10)

$\nearrow$  col. 1 total       $\nwarrow$  col. 2 total

Randomization Test - Simulate the random assignment process 1000's of times assuming  $H_0$ .

p-value = proportion of those simulations which resulted in the observed data or something more extreme

Ex:

	Survive	Not	
Metal	3	7	10
No metal	6	4	10
	9	11	20

Under  $H_0$

↳ 9 penguins would survive regardless of group assignment

Simulate: 9 survivors }  $\rightarrow$  10  
11 non-survivors }  $\rightarrow$  10  
R.A.

How to simulate w/ cards?

Total # of cards? 20 - 1 for each penguin

blue (survivors)      red (non-survivors)  
9                          11

shuffle

10 metal      10 non-metal