

### §9.3: Paired Data Tests and "Blocking"

"Paired Data" Tests are for joint r.v.  $X$  &  $Y$  that are not independent.

↳ These ideas will be discussed further in the next chapter on "Analysis of Variance" (ANOVA)

Testing difference between dependent population means.

Example: Experiment measuring "before" vs. "after" values.



Experiments making two related measurements on each subject.

Def: Paired Data comes from sampling  $(X, Y)$  as a pair  $(X_1, Y_1) (X_2, Y_2) \dots (X_n, Y_n)$

Instead of considering  $\mu_X - \mu_Y$  we will look at  $\mu_D$  where  $D_i = X_i - Y_i$  is difference in each pair.

(Note:  $\mu_D = E[D] = E[X - Y] = E[X] - E[Y] = \mu_X - \mu_Y$ )

### "Paired t-Test"

Setup: The pair  $(X, Y)$  is sampled  $n$  times.

Compute differences  $D_i = X_i - Y_i$  in each pair and average to get "sample pair mean diff."  $\bar{d}$

↳ Perform regular t-test on  $\bar{d}$ :

Hypothesis Test:

$$H_0: \mu_D = \Delta$$

equivalent to

$$H_0: \mu_X - \mu_Y = \Delta$$

Test Statistic:

$$\frac{\bar{D} - \Delta}{s_D / \sqrt{n}} \sim t(n-1)$$

p-value:

$$pt\left(\frac{-|\bar{d} - \Delta|}{s_D / \sqrt{n}}, n-1\right)$$

(where  $s_D^2$  is sample variance of  $D$ )

Benefit of paired testing: If  $X$  &  $Y$  are not independent then  $s_D^2$  (sample variance of difference) is probably much smaller than  $s_X^2 + s_Y^2$

Problem with paired testing: The number of degrees of freedom also gets smaller.

↳ Pooled variance t-Test of  $X-Y$  would have  $(n+n-2) = 2n-2$  TWICE the number of degrees of freedom!

When sample data is paired  $(X_i, Y_i)$  then usually the decrease in sample variance  $s_d^2$  results in a lower p-value (better p-value) than you would get if you ignore the pairing & do a "two-sample" test with higher degrees of freedom.

Note: You can also do paired data z-Tests, but usually paired data situations are low # samples... so most often in practice people use paired data t-Tests.

## "Blocking"

Paired data tests have such wonderfully low variance that people will sometimes artificially convert "two sample" problems into "paired data".

Def: The "blocking" method is to divide two-sample data  $X$  &  $Y$  into "blocks"

$$B^{(1)} = \left( \{X_1^{(1)}, X_2^{(1)}, \dots, X_{k_1}^{(1)}\}, \{Y_1^{(1)}, Y_2^{(1)}, \dots, Y_{j_1}^{(1)}\} \right)$$

⋮

$$B^{(n)} = \left( \{X_1^{(n)}, \dots, X_{k_n}^{(n)}\}, \{Y_1^{(n)}, \dots, Y_{j_n}^{(n)}\} \right)$$

and then perform paired data tests on means

$$(\bar{x}^{(1)}, \bar{y}^{(1)}), (\bar{x}^{(2)}, \bar{y}^{(2)}), \dots, (\bar{x}^{(n)}, \bar{y}^{(n)})$$

The lower variance of paired data often yields a lower (better) p-value.

But you should only do this if you have good justification for dividing the data into your chosen blocks.