

# Stat 412/512

## HOTELLING'S $T^2$

Mar 4 2015

# Lab today

No new material.

Your TA will be there.

Ask questions about:

- R
- Course content
- Quiz questions
- Last year's final

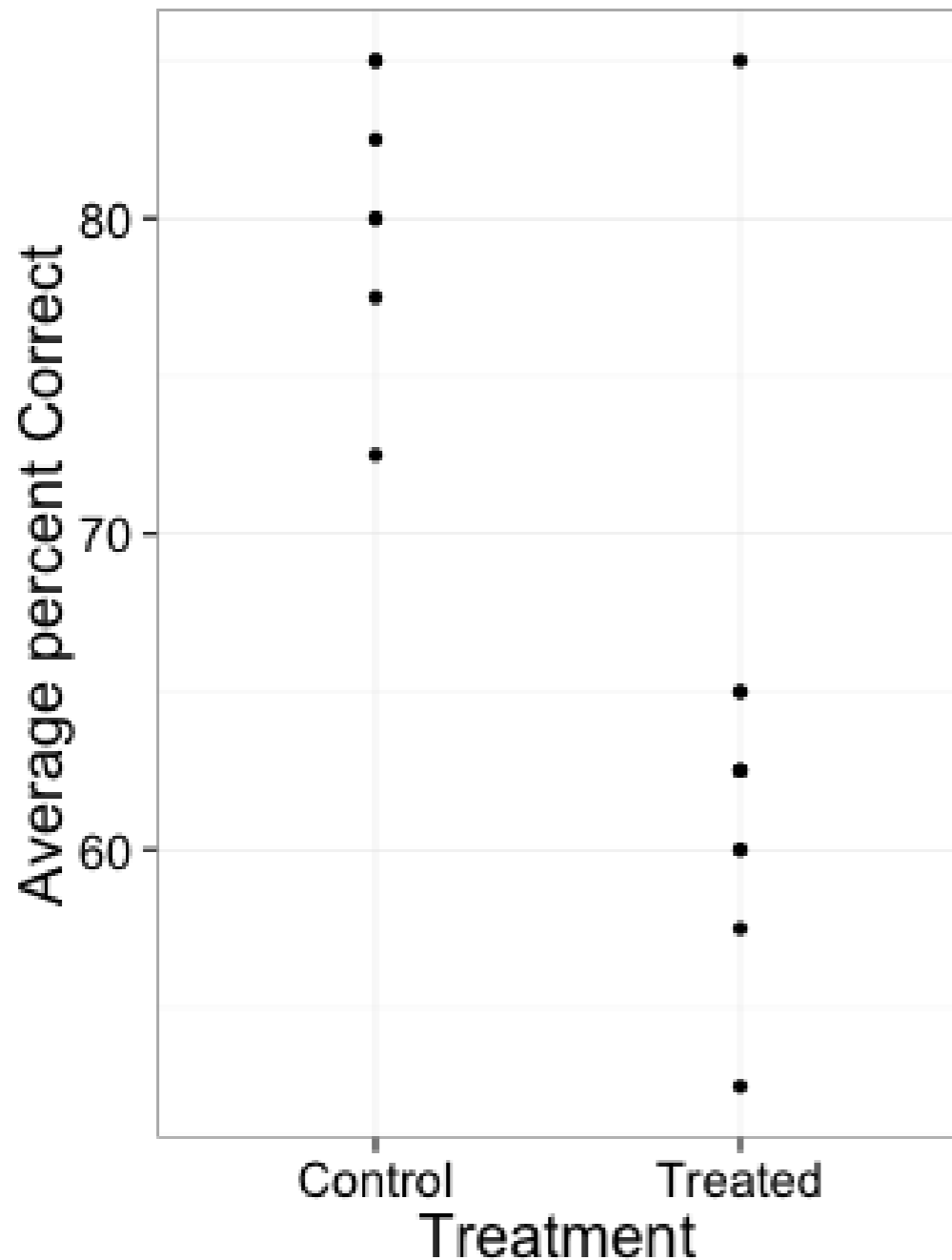
# Big Idea

Hotelling's  $T^2$  extends the “two-sample t-test” to multiple “two-sample t-test”s on different response variables.

i.e. the samples/groups/populations are the same in each but,

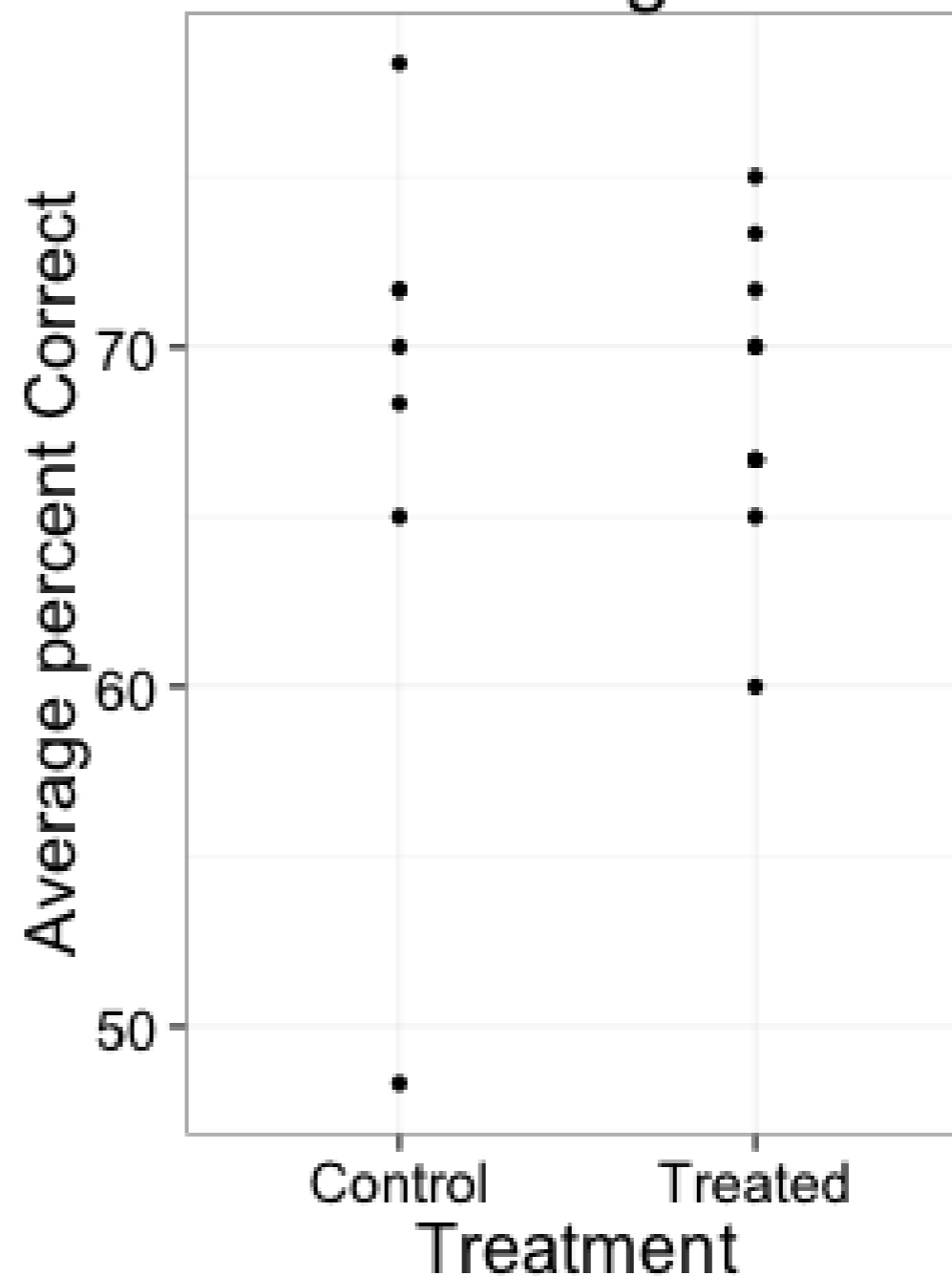
the response variable is different.

### Short



Do treated monkeys have similar short term memory to control monkeys?

### Long



Do treated monkey's have similar long term memory to control monkeys?

# Hotelling's $T^2$

An ellipse is hard to compute and hard to present.

**Hotelling's  $T^2$  adjustment** adjusts the univariate confidence intervals to conservatively approximate the ellipse.

**Hotelling's  $T^2$  statistic** provides an joint test for both parameters at once.

# An ideal model for the monkeys

1. The mean of response  $i$ , in population  $j$  is,  $\mu_{ij}$
2. Both populations have the same population standard deviations of response,  $\sigma_i$ .
3. Both populations have the same population correlation between responses (avg long term and avg short term memory).
4. Responses are normally distributed about their means.
5. Subjects are randomly sampled for each population.
6. Two groups are sampled independently.

Two “two sample t-test” assumptions +  
same correlation between responses in both populations

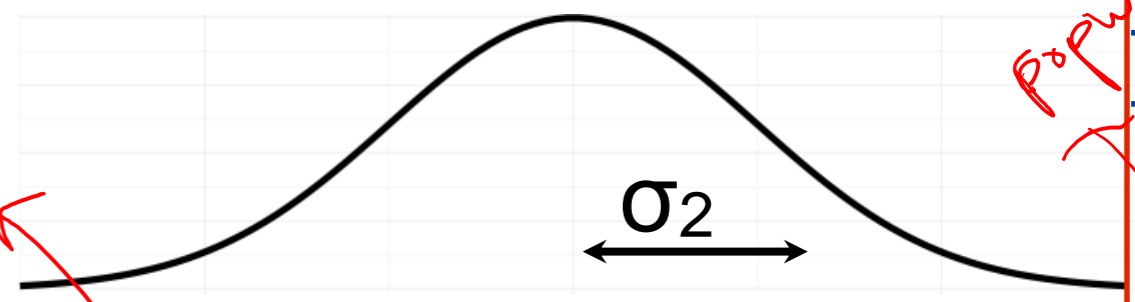
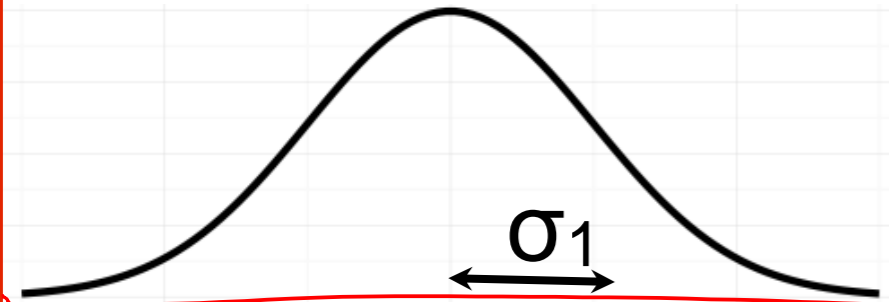
# An ideal model for the monkeys

## Short term memory

## Long term memory

Control monkeys

Control monkeys



$\mu_{11}$   
mean of response 1, population 1

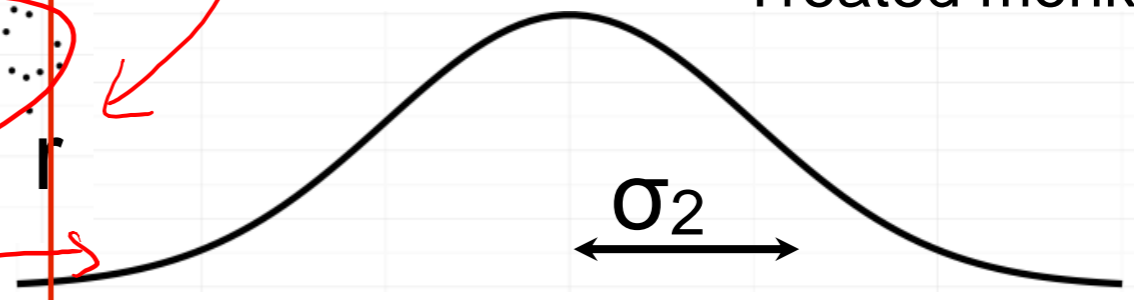
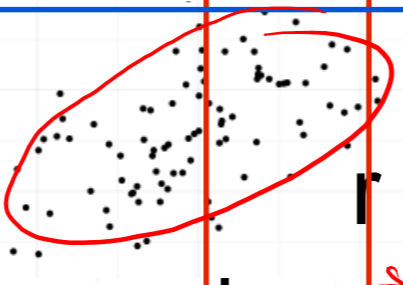
+ correlation between responses is the same for treated and control monkeys

$\mu_{21}$

population 1

Treated monkeys

Treated monkeys



*response*  
 $\mu_{12}$

*long term memory*

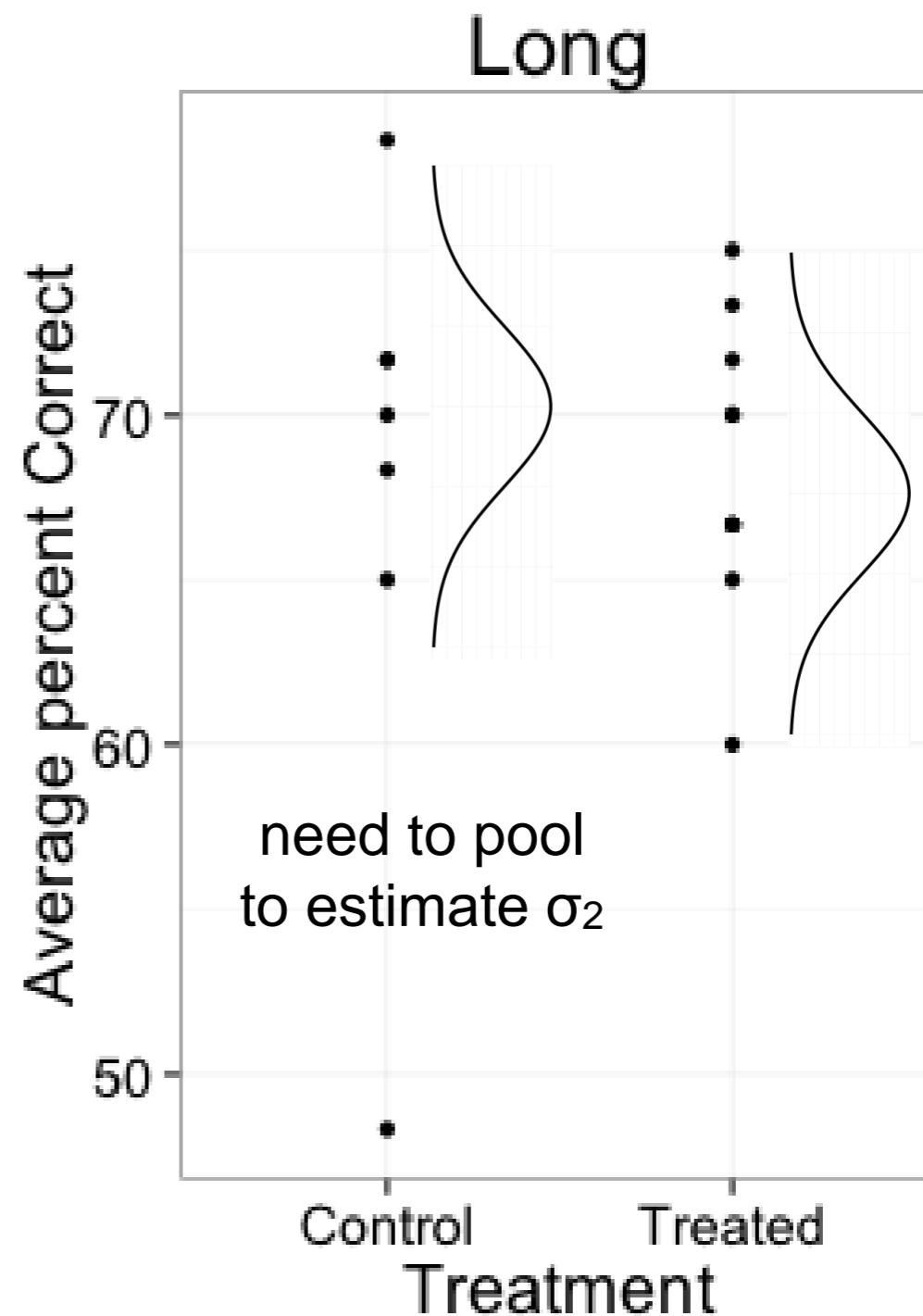
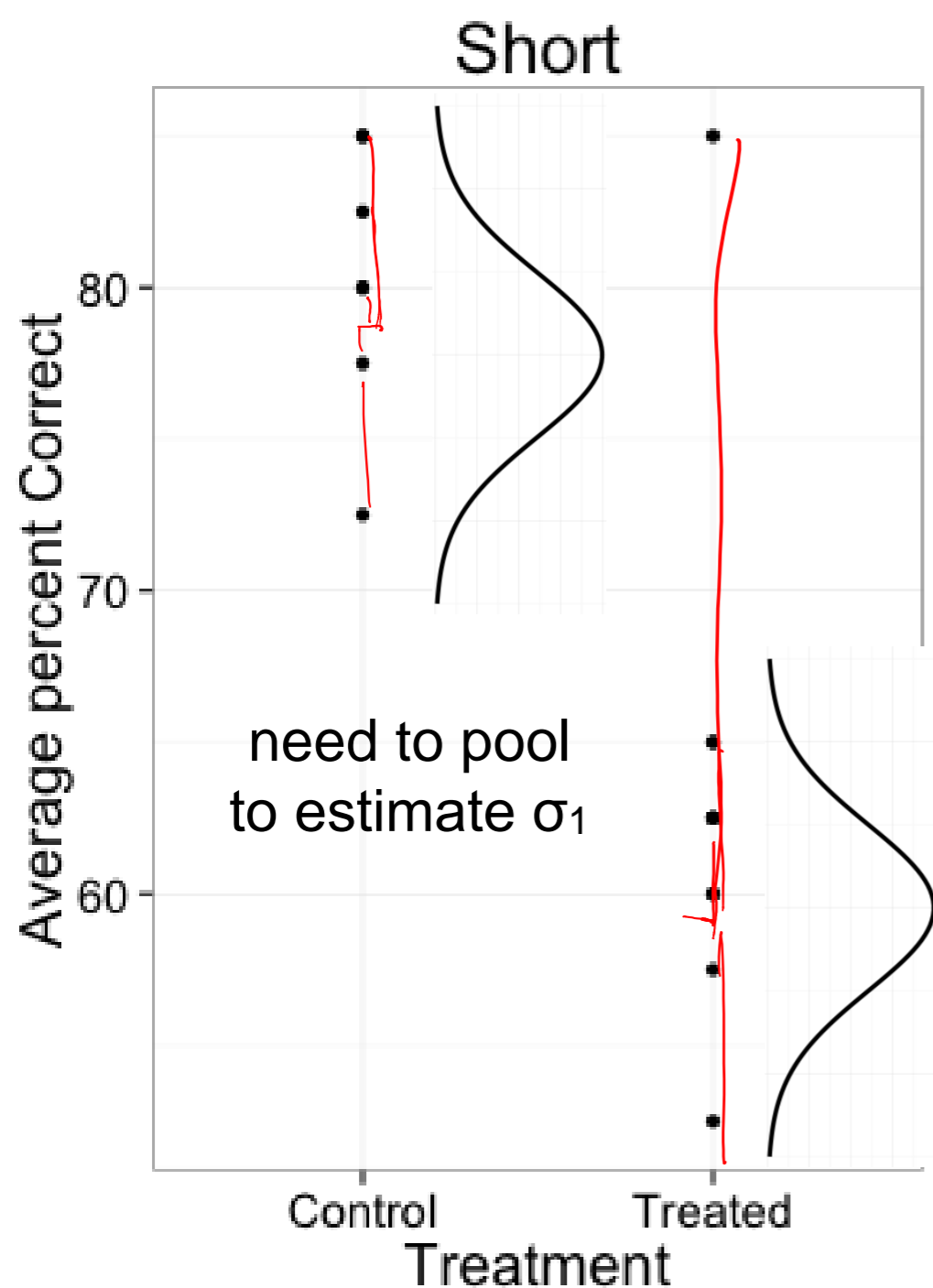
$\mu_{22}$

population 2

*response 1*

*response 2*

*responses*



Need to pool across both populations to estimate  $\sigma_1$  and  $\sigma_2$

Need to pool across both populations to estimate  $r$



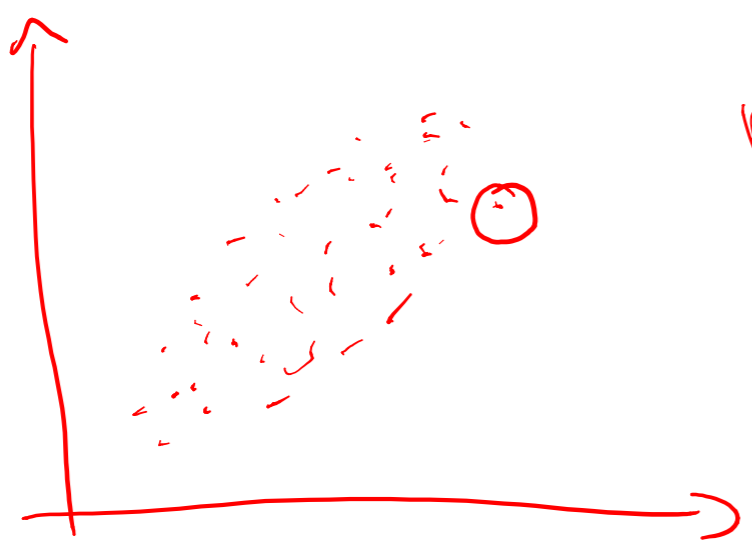
**Pooled estimates of variance and covariance for the memory example**

	<u>Control</u>	<u>Treated</u>	<u>Pooled</u>	
Sample Size (n)	7	11	18	= 7 + 11
Degrees of Freedom	6	10	16	= 6 + 10
<u>Sample variances</u>				
short-term:	19.64	65.11	$S^2_1$ 48.06	= $\frac{6(19.64)+10(65.11)}{16}$
long-term:	88.76	17.78	$S^2_2$ 44.39	=
Sample covariance	-15.67	3.75	-3.53 C	= <i>similar pooling</i>

Pooled sample correlation =  $C/(S_1 S_2)$   
 =  $-3.53/(\text{sqrt}(48.06) * \text{sqrt}(44.39))$   
 = **-0.076**

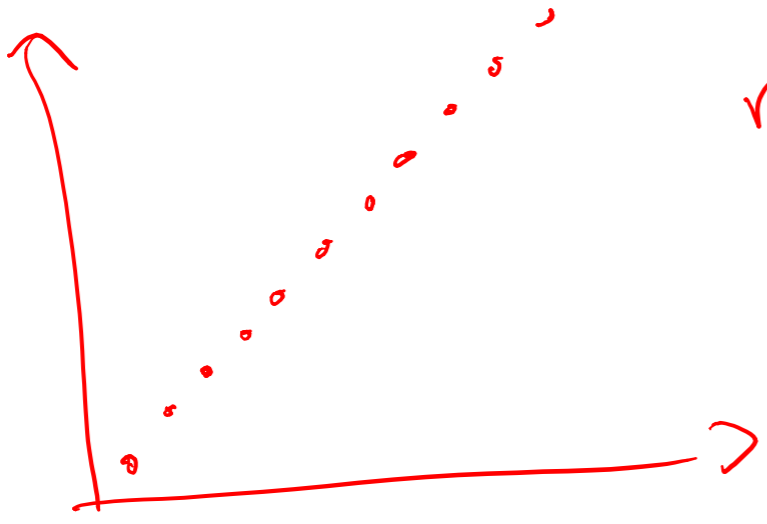
between -1 and 1  
 0 is no correlation

Response 2  
2



positively  
correlated  
 $\sim 0.6 - 0.8$

Response 1



$r = 1$



our case

# Hotelling's $T^2$ statistic



**Null:** null is true in both tests

$$T^2 = \frac{t_1^2 + t_2^2 - 2Rt_1t_2}{1 - R^2}$$

*pooled  
correlation  
between responses*

where  $t_1$  and  $t_2$  are individual t-statistics for each response,  
 $R$  is the correlation between responses.

Under the ideal model,

$$F = \frac{n_1 + n_2 - 3}{2(n_1 + n_2 - 2)} T^2$$

has an F distribution with

2 and  $n_1 + n_2 - 3$  degrees of freedom

We have convincing evidence against  
the difference in mean long term memory between treated  
and control monkeys **and**  
the difference in mean short term memory between treated  
and control monkeys  
**both** being zero.

(Alternate wording) We have convincing evidence at least  
one of  
the difference in mean long term memory between treated  
and control monkeys **and**  $= 0$   
the difference in mean short term memory between treated  
and control monkeys  $\neq 0$   
**is not zero.**

Hotelling's  $T^2$  calculations for the memory example

	short-term	long-term
1 (Control-Treatment) Average Differences	$17.18 = (80.36 - 63.18)$	$-0.71 = (67.62 - 68.33)$
2 Standard Errors	$3.35 = 6.93 \sqrt{\frac{1}{7} + \frac{1}{11}}$	$3.22 = 6.66 \sqrt{\frac{1}{7} + \frac{1}{11}}$
3 t-statistics for individual hypotheses of no difference	$5.12 = \frac{17.18}{3.35}$	$-0.22 = \frac{-0.71}{3.22}$
4 Hotelling's $T^2$	$26.28 = \frac{(5.12)^2 + (-0.22)^2 - 2(5.12)(-0.22)(-.0765)}{1 - (-.0765)^2}$	
5 F-statistic	$12.32 = \frac{(15)(26.28)}{(2)(16)}, \quad df = 2, 15$	

$1 - pf(12.32, 2, 15) = 0.00068$

# Joint confidence intervals

An ellipse is the best description of our joint confidence, but

Hotelling's adjusted confidence intervals guarantee at least 95% confidence

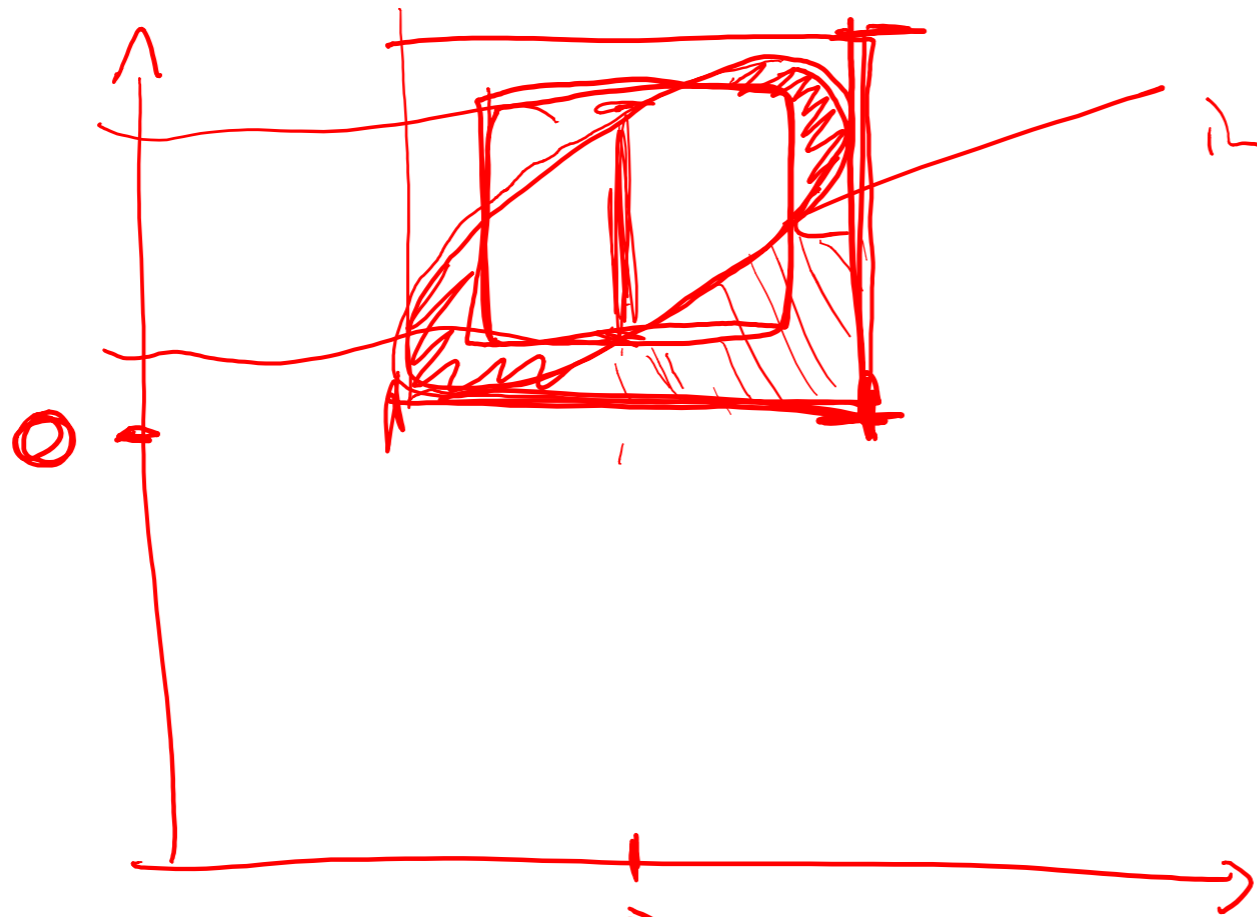
**estimate**  $\pm$  **multiplier**  $\times$  **SE**

multiplier =

$$\sqrt{\frac{2(n_1 + n_2 - 2)}{n_1 + n_2 - 3} F_{2, n_1 + n_2 - 3}(1 - \alpha)}$$

**2.803** for the monkey study  
(compare to 2.120 for the usual t CIs)

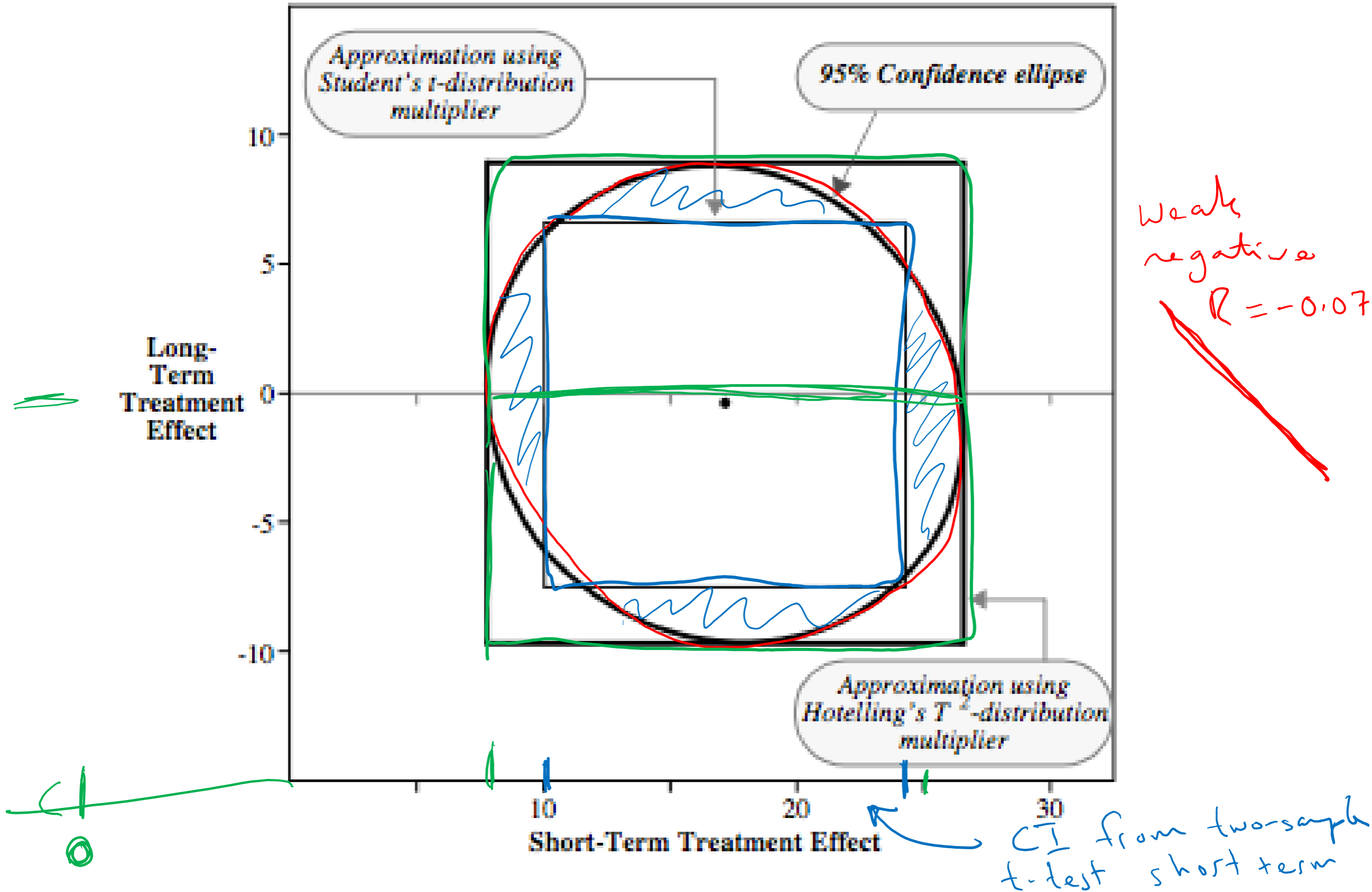
$\mu_{short, T} - \mu_{short, C}$



Individual  
confidence  
intervals

$\mu_{Longterm, Treated} - \mu_{Longterm Control}$

**95% confidence ellipse for differences in long-term and short-term memory means, and approximate confidence rectangles, constructed with  $T^2$  and  $t$  multipliers**





# Checking the ideal model

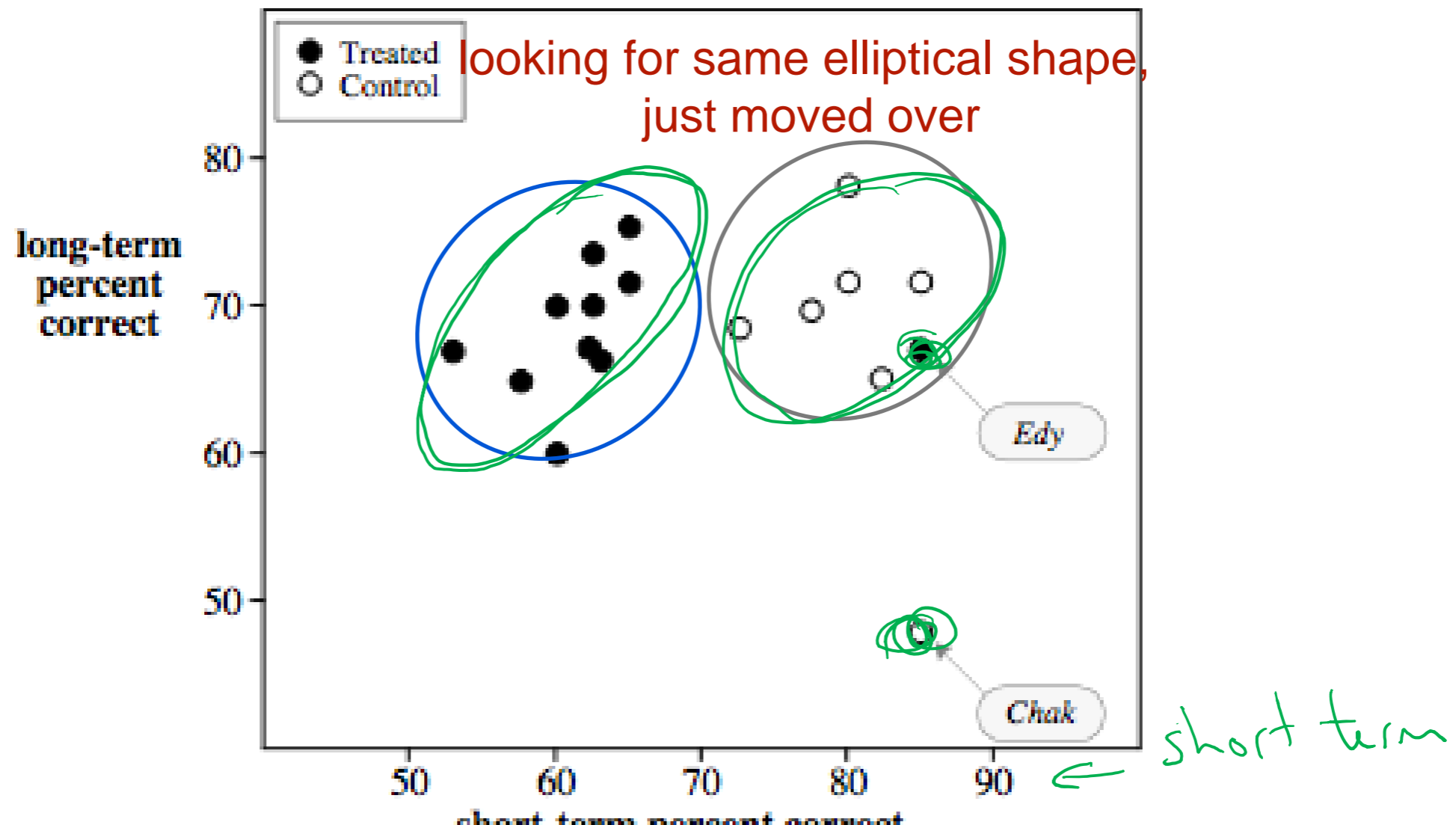
Use usual tools for checking equal SDs and normality.

Also check ...

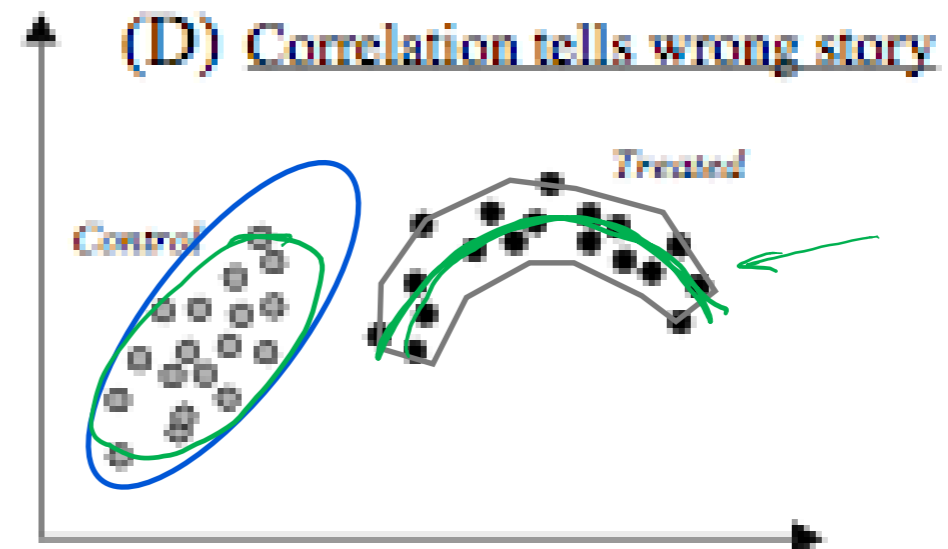
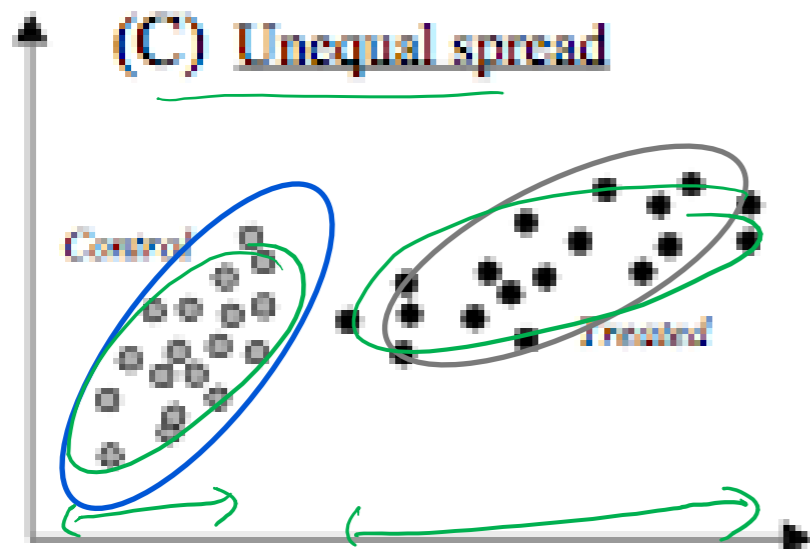
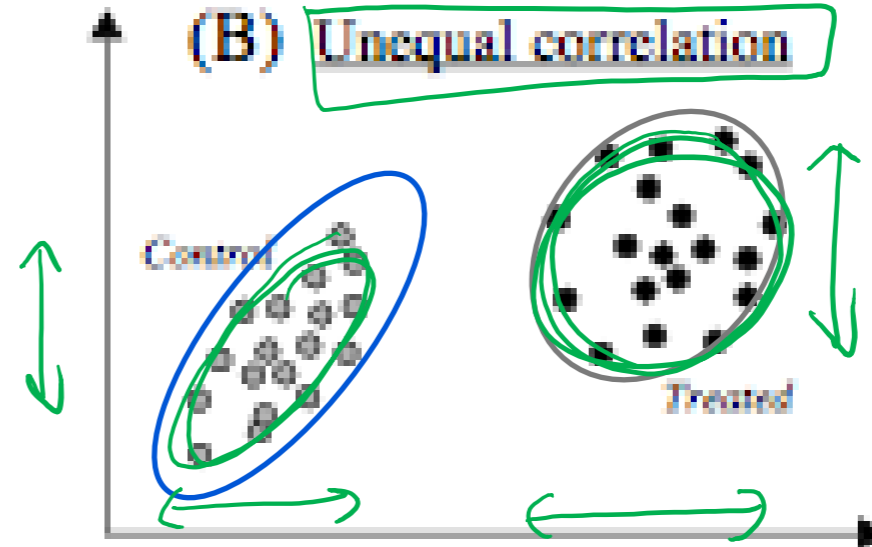
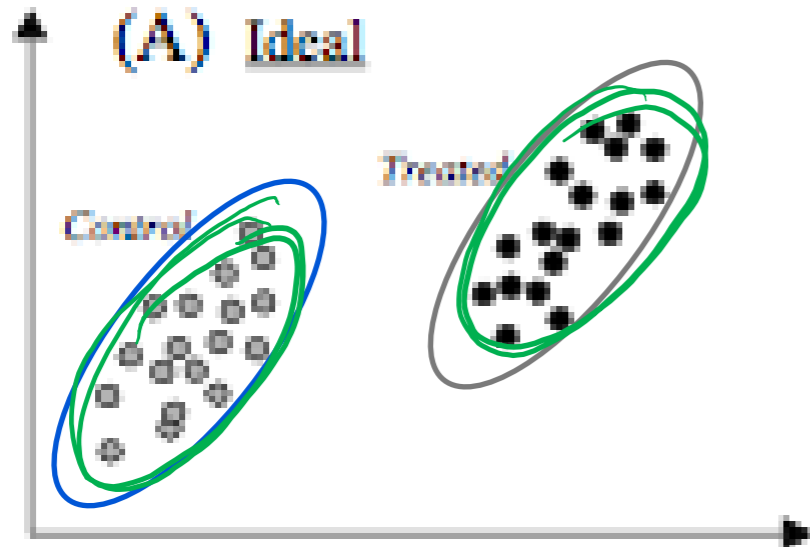
Display 16.7

p. 477

Scatter plot of short- and long-term memory scores, by treatment group



Diagnostic patterns for correlated responses in the two-sample problem.  
(Hypothetical data)



# Strategies

- ① A single univariate analysis on a summary of the multivariate response.
- ② Separate univariate analyses on several summaries.
- ③ Multivariate analysis on several summaries. *Hotelling's  $T^2$*
- ④ Treat subject as a factor.