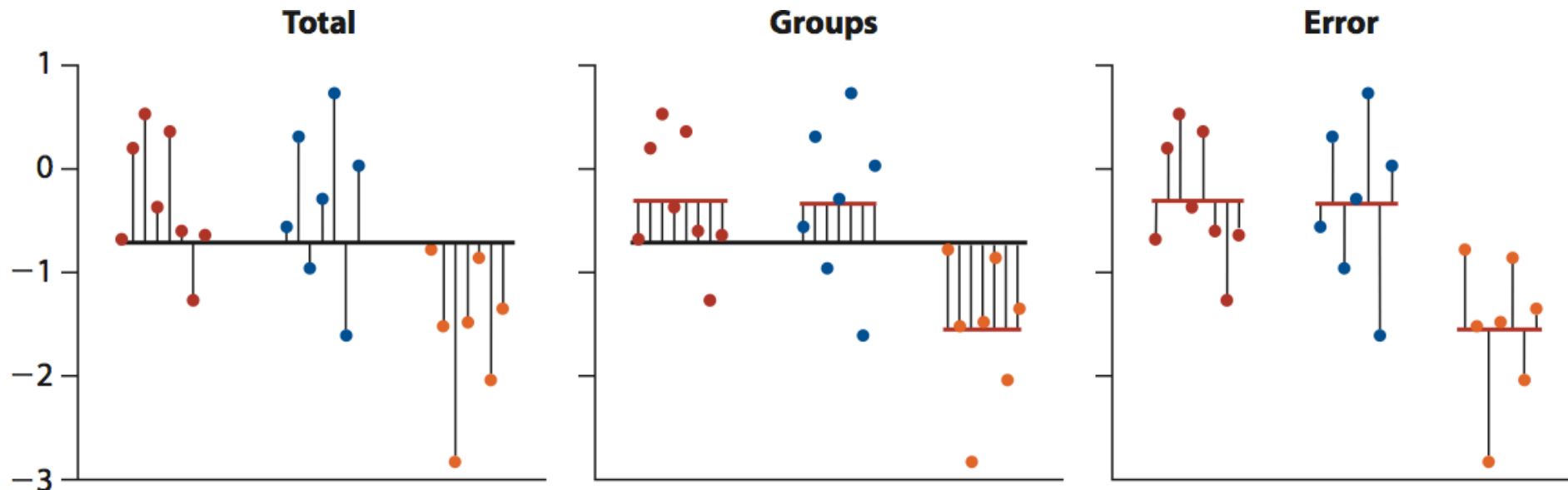


# General Linear Models

# General linear model

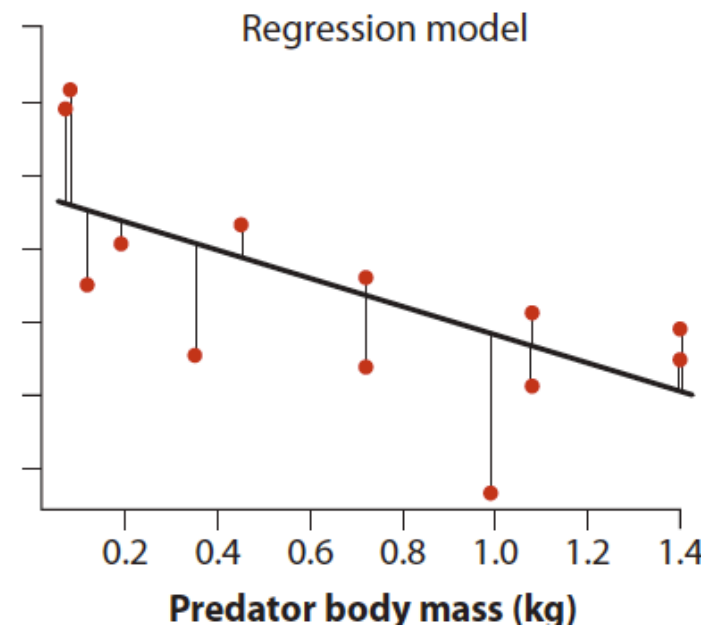
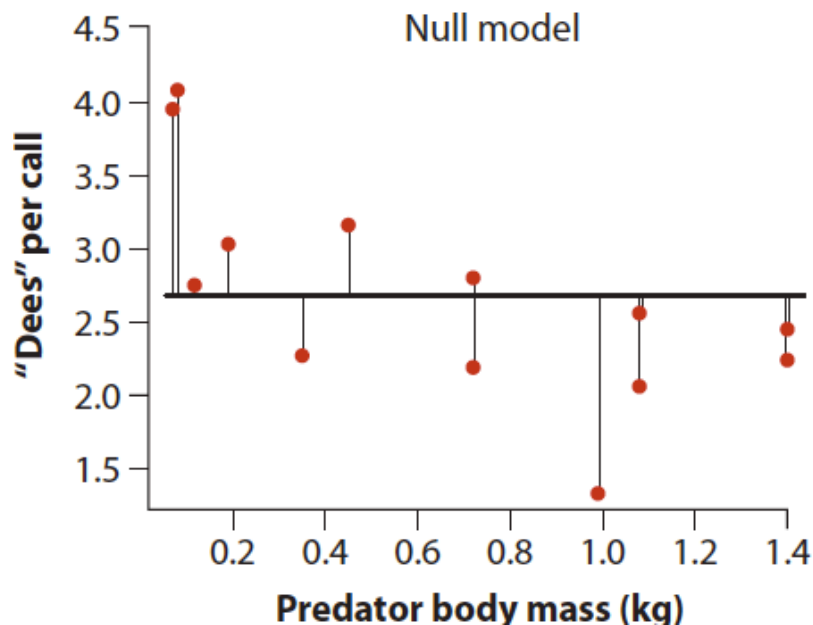
- Response variable,  $Y$ , can be represented by a linear model plus random error
  - Scatter of  $Y$  measurements around the model is random error
- So far, we have looked at (univariate) ANOVA



# General linear model

- We have also looked at the linear regression

$$Y = \alpha + \beta X + \varepsilon$$



# General linear model

- Extends the linear regression in two ways
  - More explanatory variables ( $>1$ )
  - Allows use of **categorical** explanatory variables
- Example:
  - Linear model for single-factor ANOVA

$$Y = \mu + A$$

# General linear model

– Extends the linear regression in two ways

- More explanatory variables
- Allows use of **categorical** explanatory variables
- Example:
  - Linear model for single-factor ANOVA

$$Y = \mu + A$$

Grand Mean

Treatment Effect

## General linear model

- Linear Model for single-factor ANOVA
- Linear Regression

$$Y = \mu + A_i, \quad A_i = \text{group mean} - \mu$$

$$Y = \alpha + \beta X$$

You are fundamentally fitting two models  
in both of these cases

RESPONSE = CONSTANT + VARIABLE

## General linear model

We have already encountered some methods which are actually specific examples of the general linear model:

- Linear regression
- One factor ANOVA
  - t-test

Additionally, we will encounter these:

- Analysis of covariance (video 20)
  - Multiple regression

General linear model

Linear Model	Other Name	Example-study Design
$Y = \mu + X$	Linear Regression	Dose-Response
$Y = \mu + A$	One-way ANOVA	Completely randomized
$Y = \mu + A + b$	Two-way ANOVA, no replication	Randomized block
$Y = \mu + A + B + A*B$	Two-way, fixed effects ANOVA	Factorial Experiment
$Y = \mu + A + b + A*b$	Two-way, mixed effects ANOVA	Factorial Experiment
$Y = \mu + X + A(+A*X)$	Analysis of Covariance (ANCOVA)	Observational Study
$Y = \mu + X_1 + X_2 + X_1*X_2$	Multiple Regression	Dose-Response



*Match the linear model with the "name of the test" and a given (example study design).*

Variable Descriptions:

$\mu$  = Constant                      X = Numerical explanatory variable                      Y = Numerical response variable

A, B = Fixed, categorical variables                      b = Random-effect categorical variable (ex. blocking)

1)  $Y = \mu + X$

2)  $Y = \mu + A$

3)  $Y = \mu + X + A$

4)  $Y = \mu + A + B + A*B$

I) "Linear Regression" (Dose-response)

II) "One-way, single factor, ANOVA" (Completely randomized)

III) "Two-way, fixed-effect ANOVA" (Factorial experiment)

IV) "Analysis of covariance, ANCOVA" (Observational study)

**Clicker Choices:**

A) 1=I, 2=II, 3=III, 4=IV

B) 1=I, 2=II, 3=IV, 4=III

C) 1=II, 2=I, 3=IV, 4=III

D) 1=III, 2=IV, 3=I, 4=II

E) 1=II, 2=I, 3=III, 4=IV

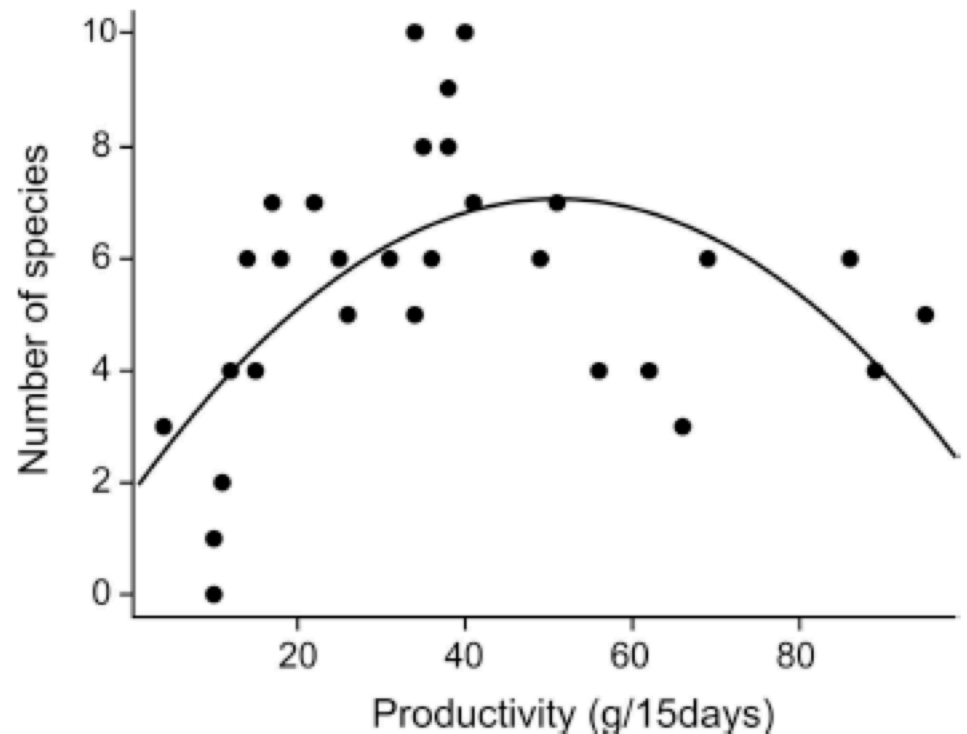
## Note: General linear model

In the form:

$$Y = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \dots + \text{error}$$

Doesn't have to be LINEAR relationship:

$$Y = \beta_0 + \beta_1 X + \beta_2 X^2 \text{ (Quadratic)}$$



## General linear models:

$H_0$ : Treatment means are same

$H_A$ : Treatment means are not all the same

Significance of a treatment variable is tested by comparing the fit of two models,  $H_0$  and  $H_A$ , to the data by using **F-test**

$$\text{F-test} = \frac{H_A}{H_0} = \frac{\text{Constant} + \text{Variable}}{\text{Constant}}$$

*Does the additional parameter, the variable, improve the fit of the data significantly?*

- ANOVA table
- P-value leads to rejection or FTR  $H_0$

# Often appropriate/useful to investigate $>1$ explanatory variable simultaneously

- Efficiency
- Interactions

## Three major approaches:

- Blocking
  - Improve detection of treatment effects
  - If nuisance variable is known and controllable
- Factorial experiment
  - Investigate effects of  $\geq 2$  treatment variables
  - Interactions
- Covariates
  - Confounding variables
  - Nuisance variable is known but uncontrollable

## Assumptions of general linear models:

- Test these by using **residual plots**
- Same as for regression and ANOVA
  - Random sample from the population of possible measurements
  - Normal distribution
  - Variance of response variable is the same for all combinations of the explanatory variables