

# **LINEAR REGRESSION**

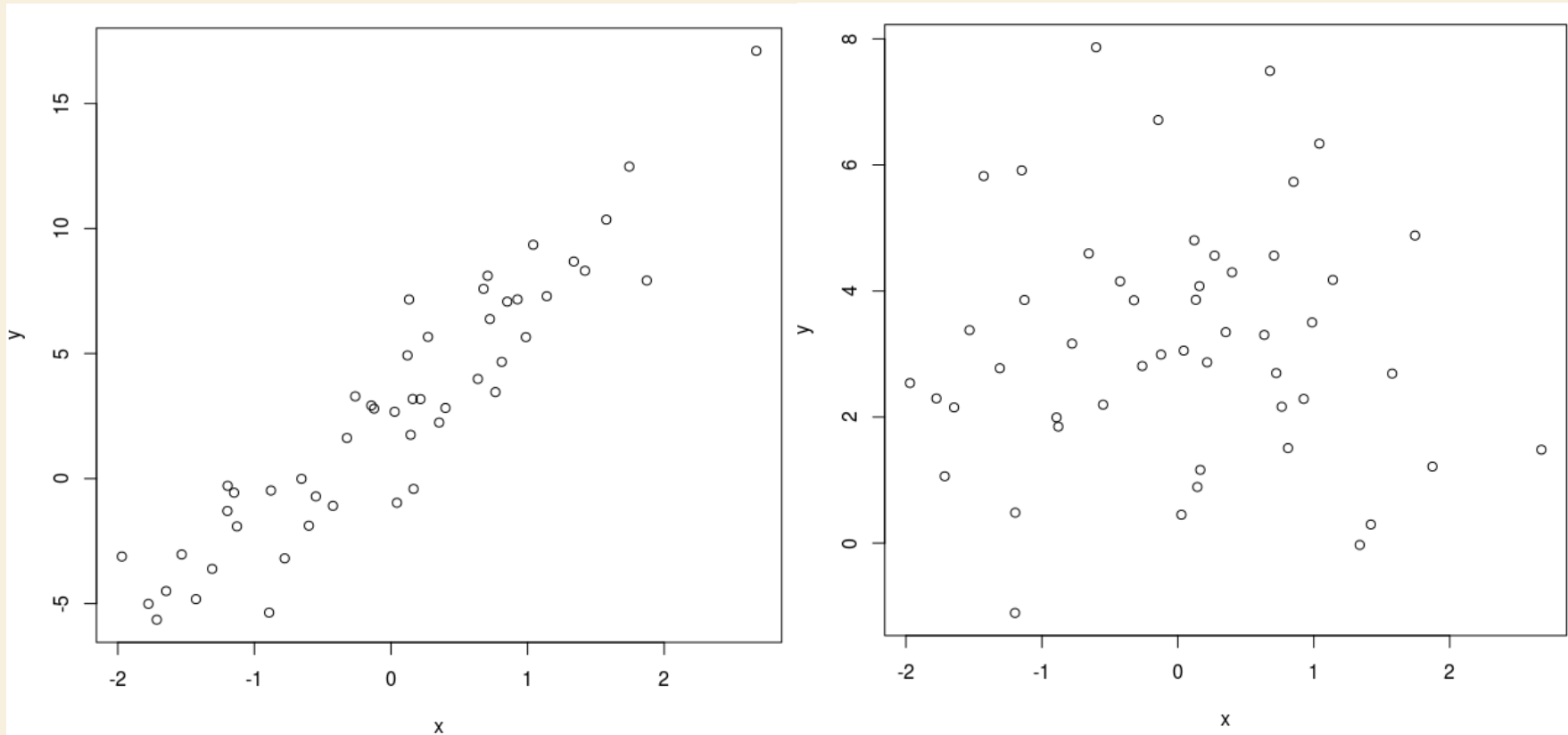
TWO CONTINUOUS  
VARIABLES

**BRIAN STOCK**

**03.27.17**

# LINEAR REGRESSION

- Predicts  $Y$  from  $X$  (both continuous)  $Y = \alpha + \beta X$

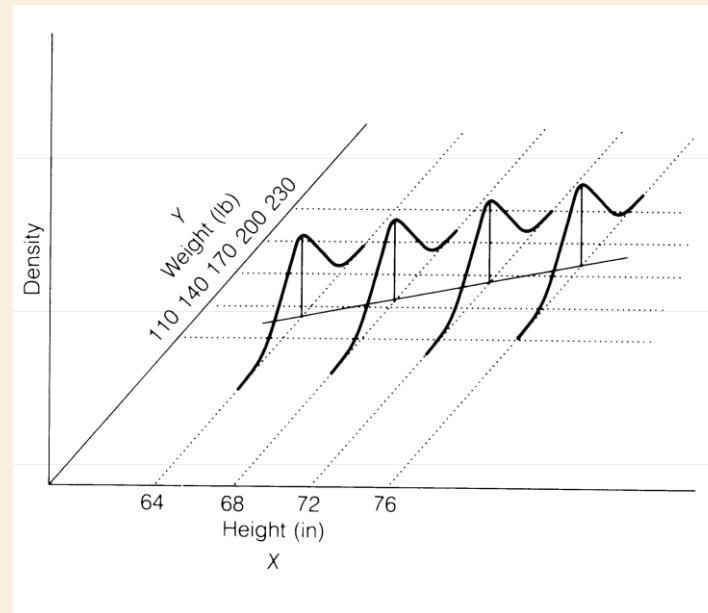


# REGRESSION ASSUMES...

1. Random sample
2. The relationship between  $X$  and  $Y$  can be described by a **line**:  $Y = \alpha + \beta X$

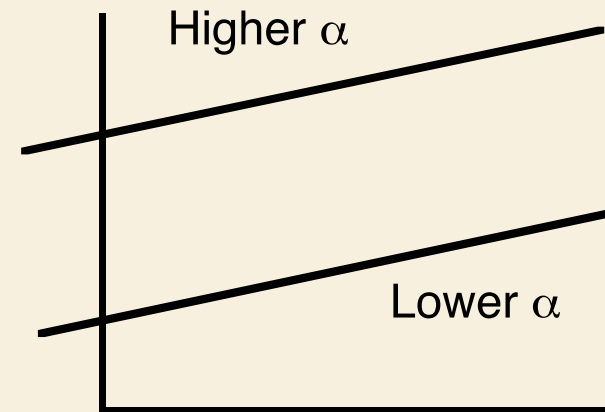
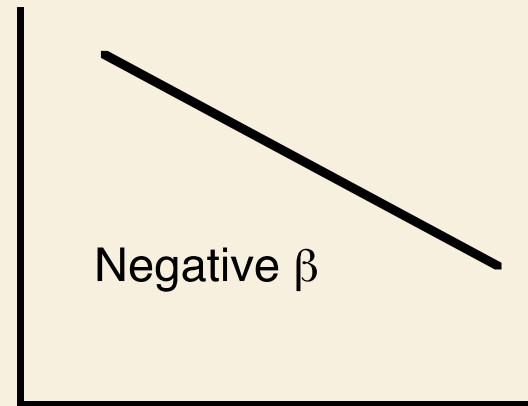
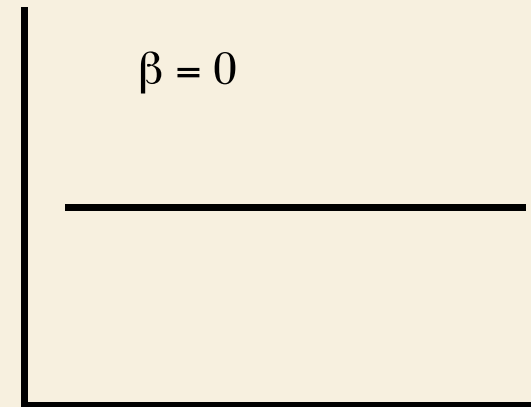
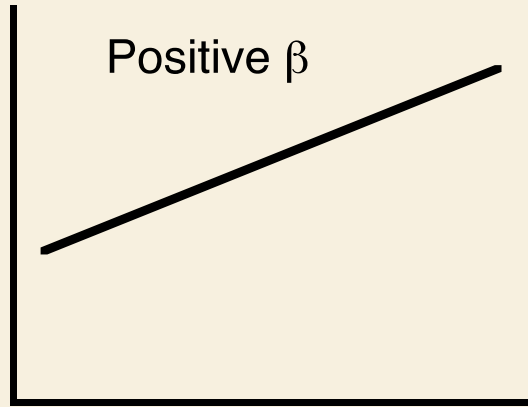
# REGRESSION ASSUMES...

1. Random sample
2. The relationship between  $X$  and  $Y$  can be described by a **line**:  $Y = \alpha + \beta X$
3.  $Y$  is normally distributed with equal variance for all values of  $X$

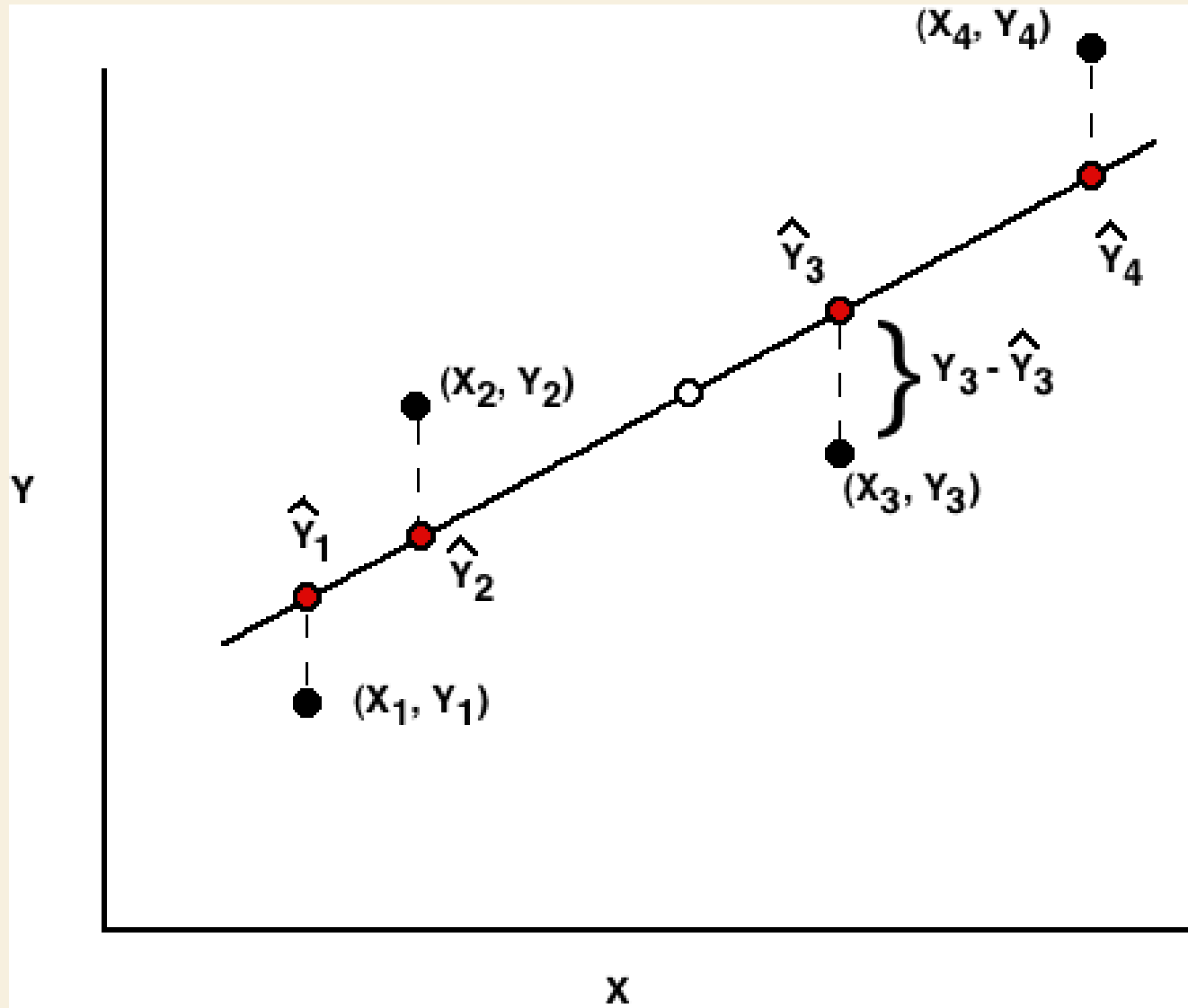


# 2 PARAMETERS

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



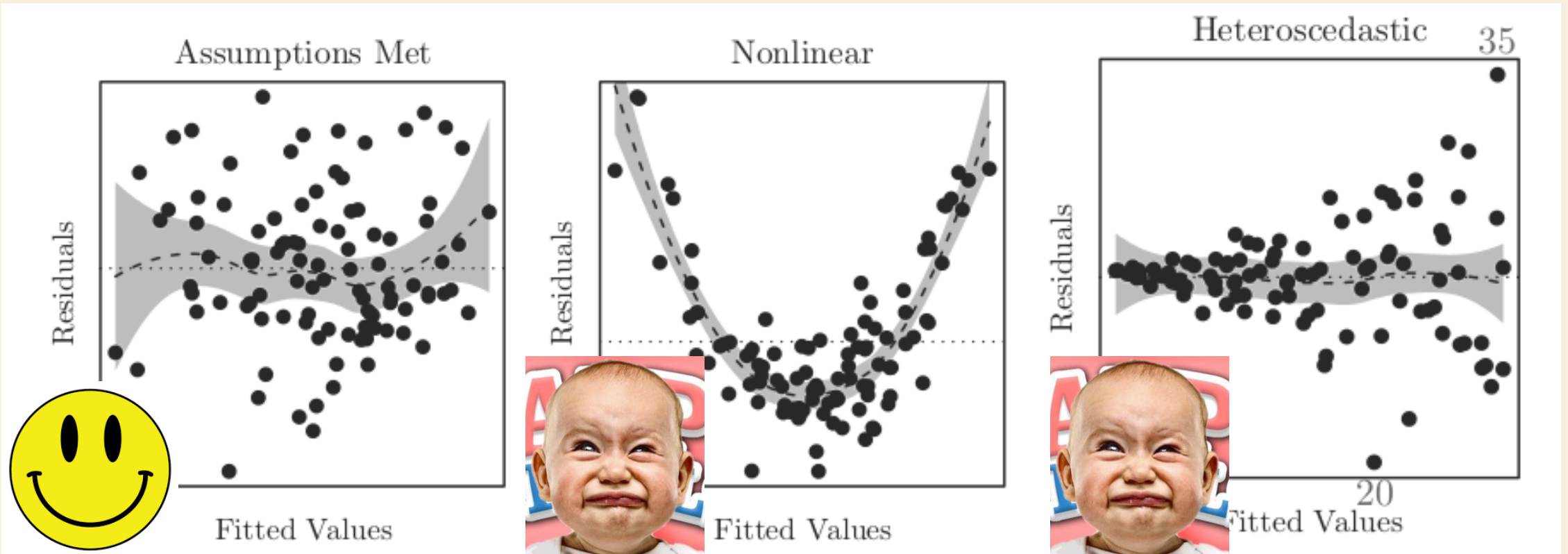
# “RESIDUAL”



$$Y_i - \hat{Y}_i$$

# RESIDUAL PLOTS

1. Normal (no pattern)
2. Equal variance



# FINDING THE "LEAST SQUARES" REGRESSION LINE

Minimize:

$$SS_{residual} = \sum_{i=1}^n (y_i - \hat{y}_i)^2$$

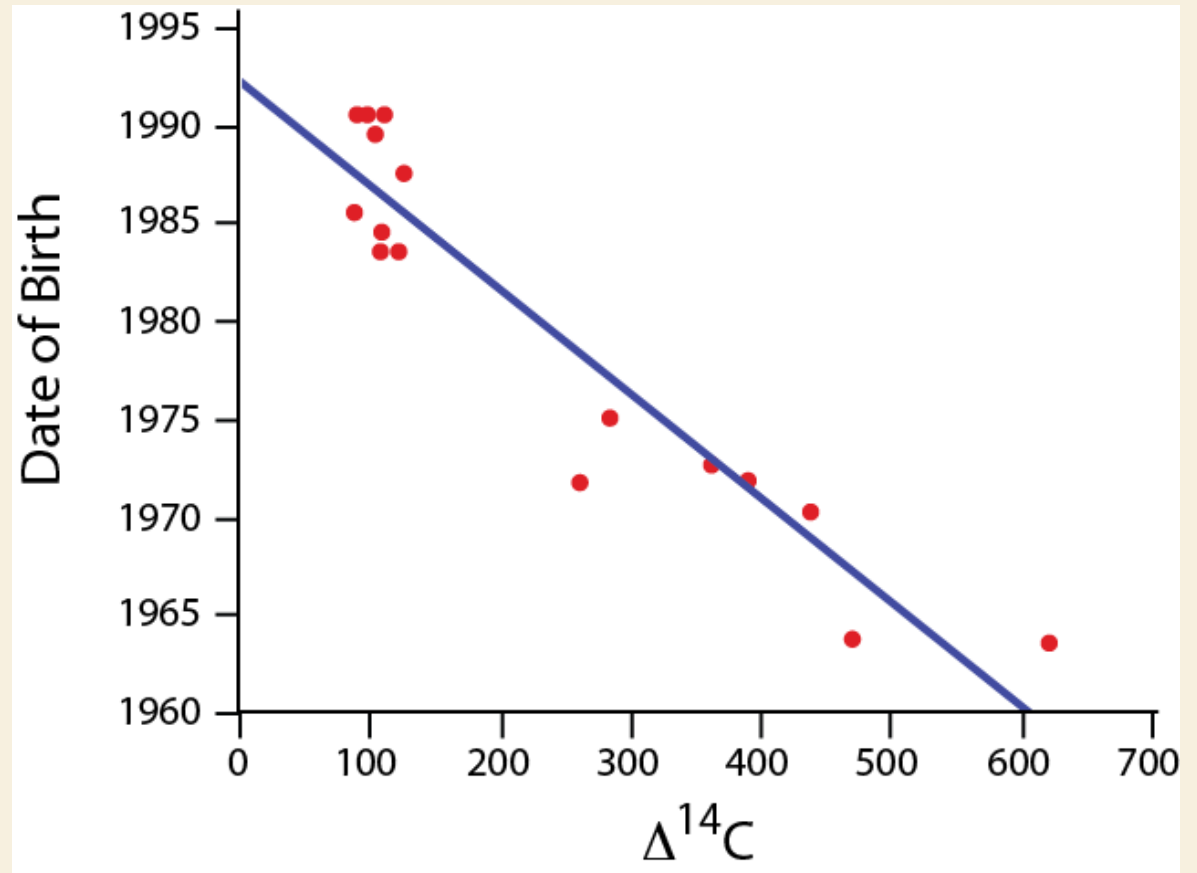
Your computer does this for you...



# EX: AGE ~ TOOTH RADIOACTIVITY

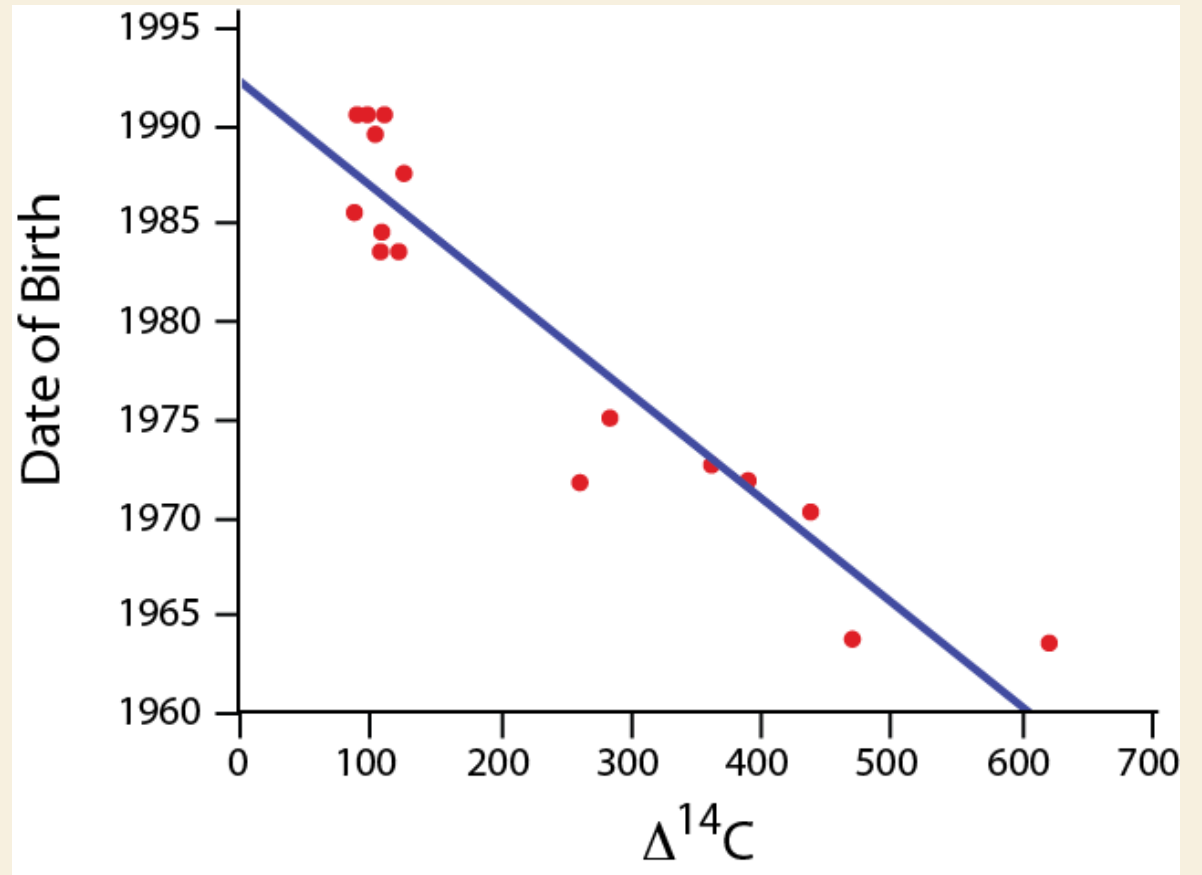
Many above ground nuclear bomb tests in the '50s and '60s may have left a radioactive signal in developing teeth.

Is it possible to predict a person's age based on dental  $C^{14}$ ?



# EX: AGE ~ TOOTH RADIOACTIVITY

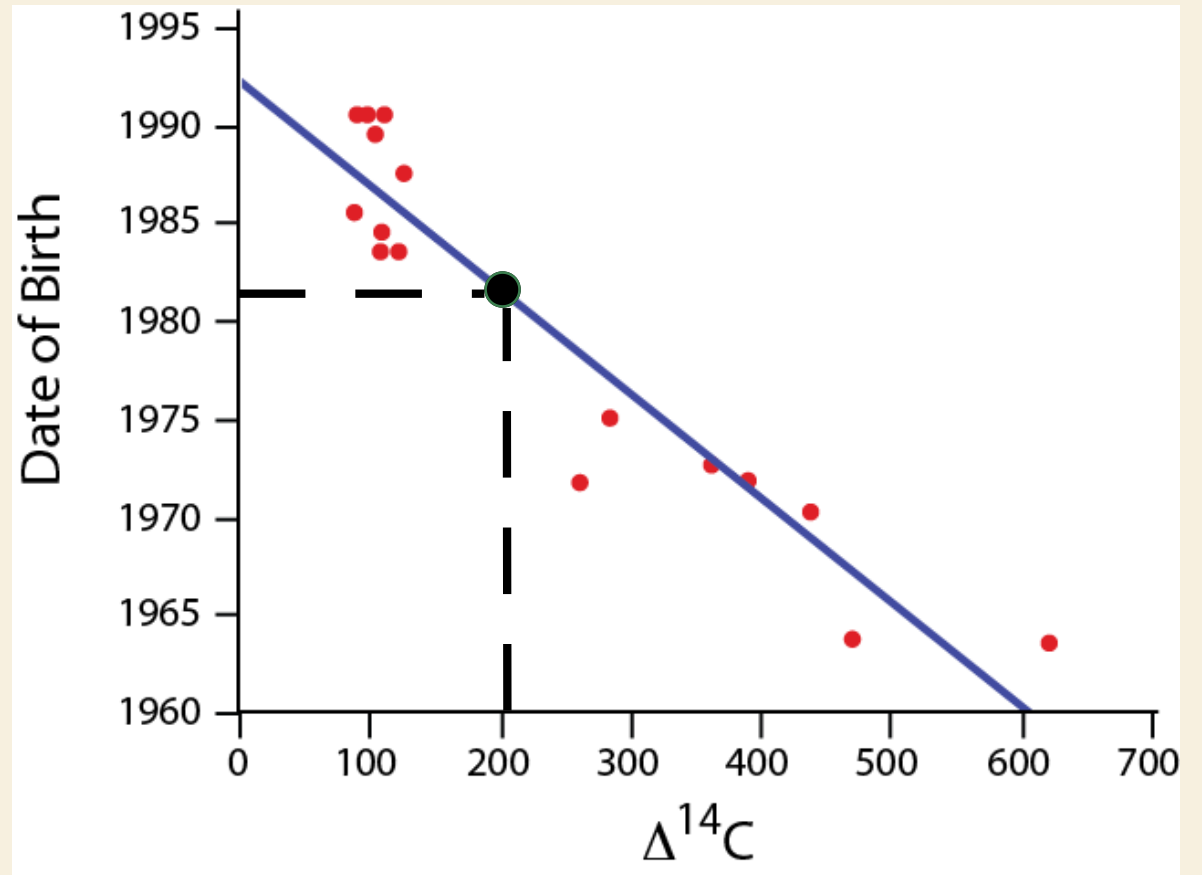
$$\hat{Y} = 1992.2 - 0.053X$$



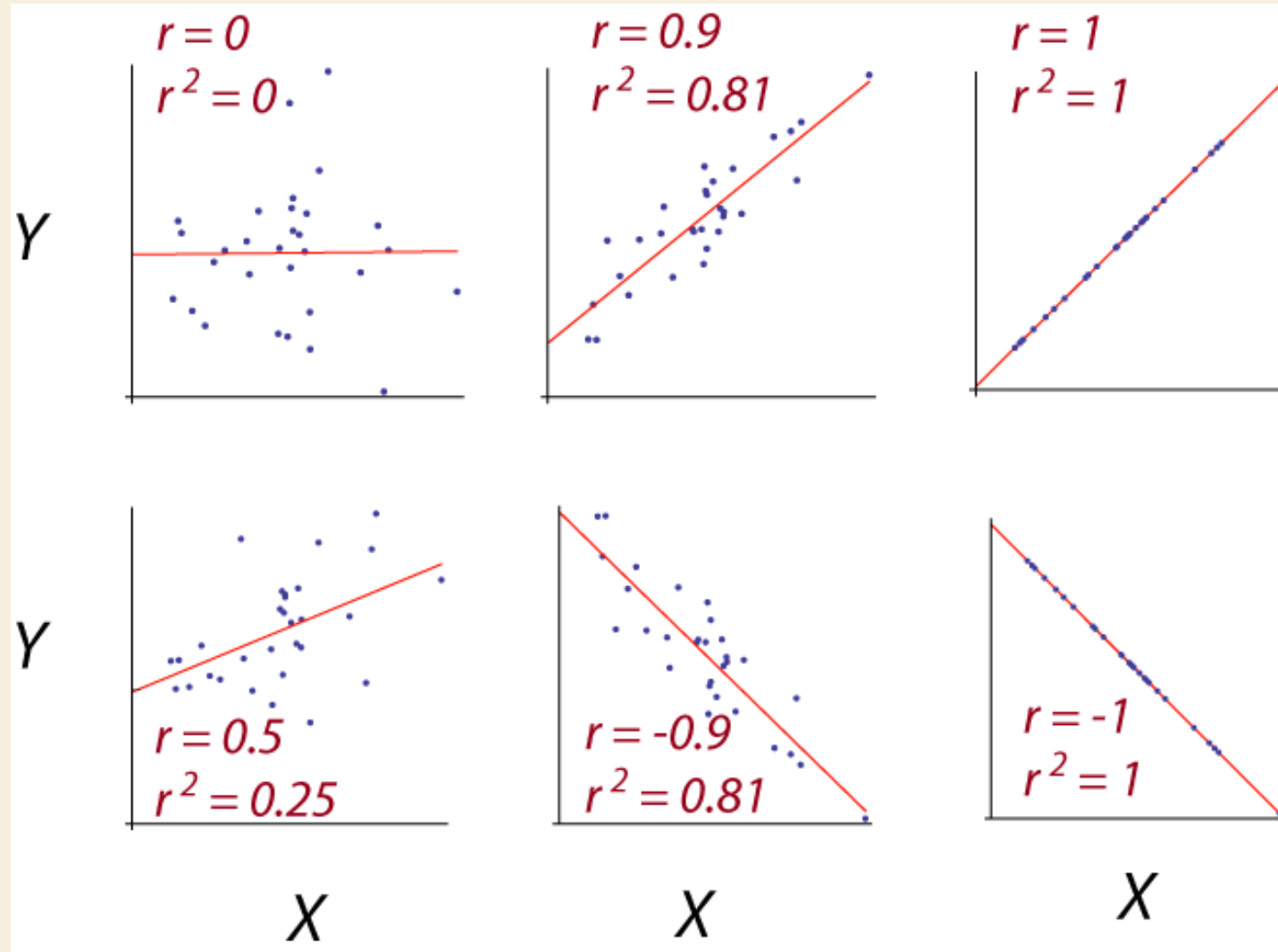
# PREDICTING Y FROM X

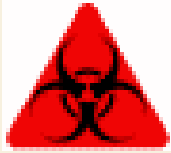
If a cadaver has a tooth with  $\Delta^{14}\text{C} = 200$ , what does the linear model predict its year of birth to be?

$$\begin{aligned}\hat{Y} &= 1992.2 - 0.053X \\ &= 1992.2 - 0.053(200) \\ &= 1981.6\end{aligned}$$

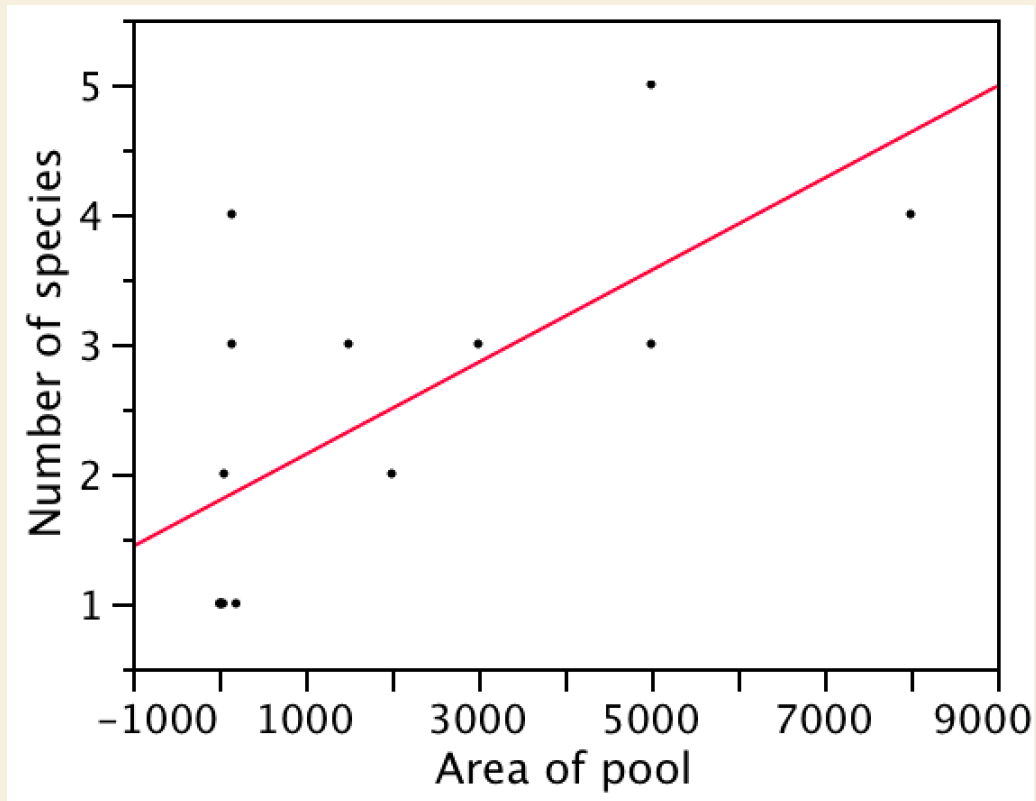


**$R^2$**  predicts the amount of variance in  $Y$  explained by the linear model





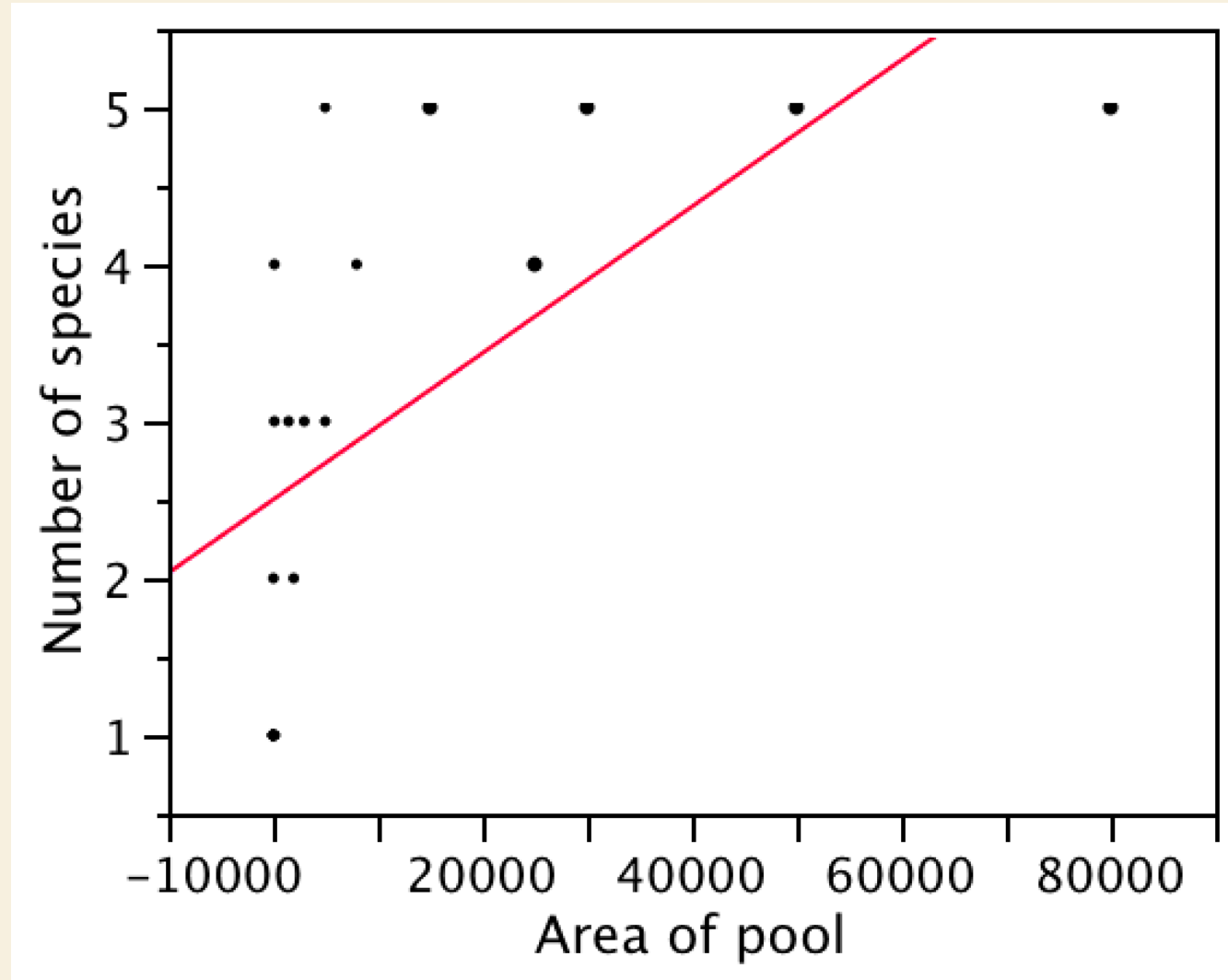
**CAUTION:** IT IS UNWISE TO  
EXTRAPOLATE BEYOND THE  
RANGE OF THE DATA.



Number of species of  
fish as predicted by the  
area of a desert pool

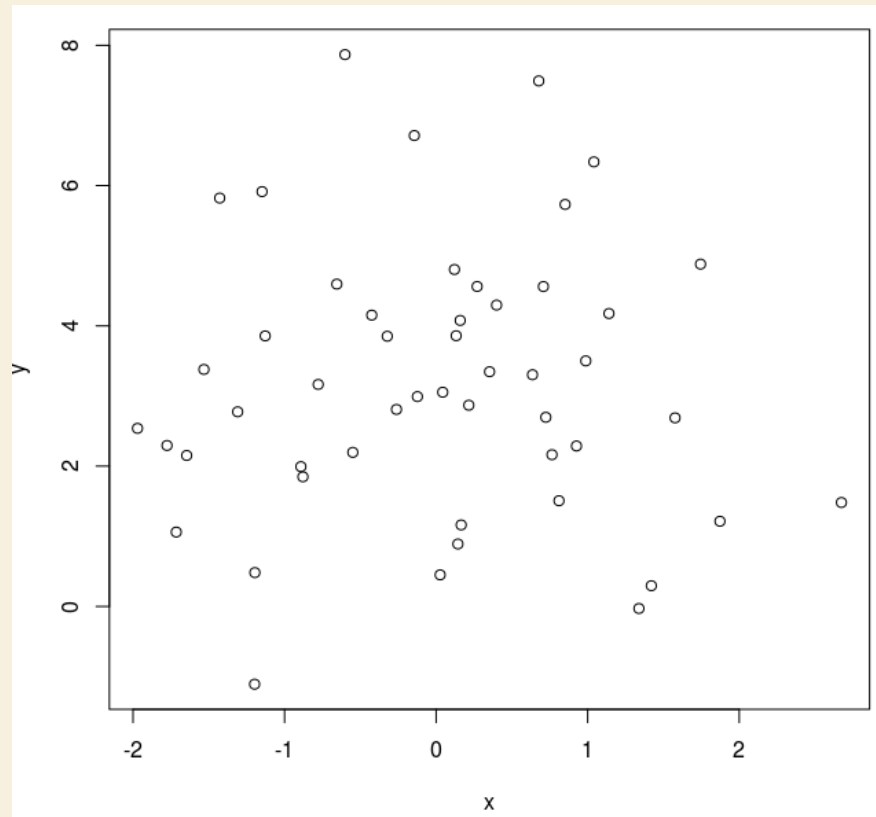
If we were to extrapolate to ask how  
many species might be in a pool of  
 $50000\text{m}^2$ , we would guess about 20.

# MORE DATA ON FISH IN DESERT POOLS

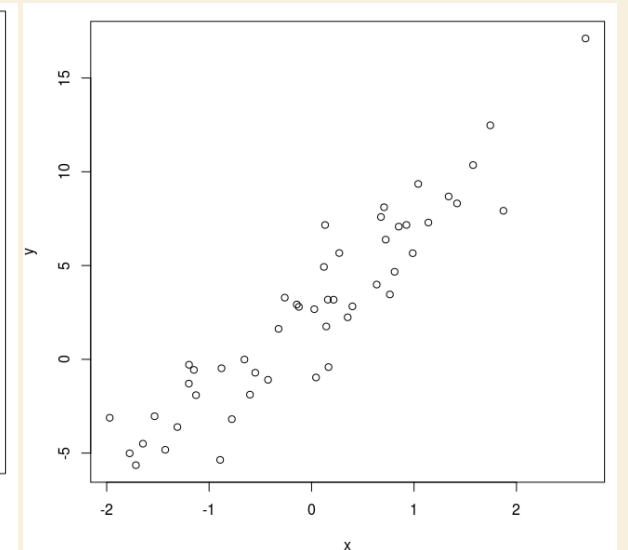
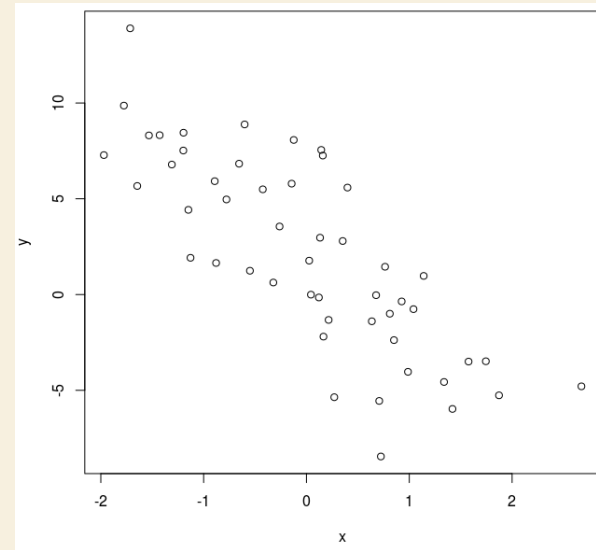


# REGRESSION HYPOTHESES

$$H_0: \beta = 0$$



$$H_A: \beta \neq 0$$



# HYPOTHESIS TEST: $\beta$

$$H_0: \beta = 0$$

$$H_A: \beta \neq 0$$

$$t = \frac{b - b_0}{SE_b}$$

$$t = \frac{-0.053 - 0}{0.004} = 13.25$$

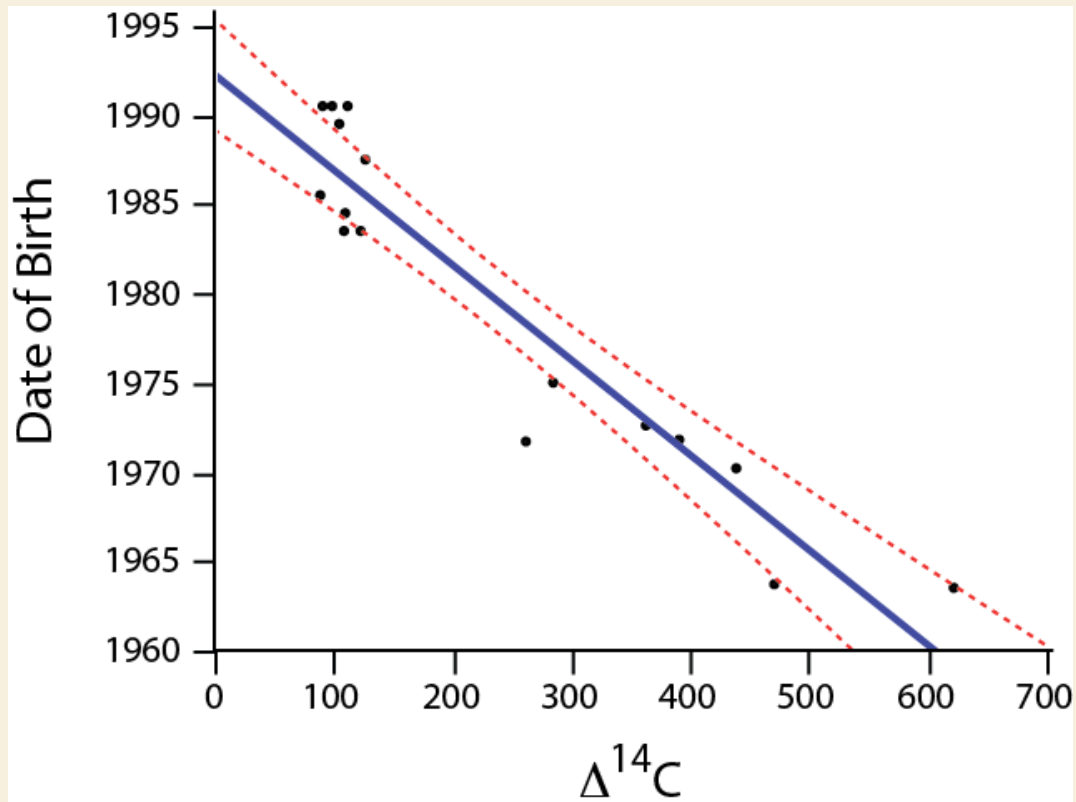
$$t_{0.0001(2), 14} = \pm 5.36$$

So we can reject  $H_0$ ,  $P < 0.0001$

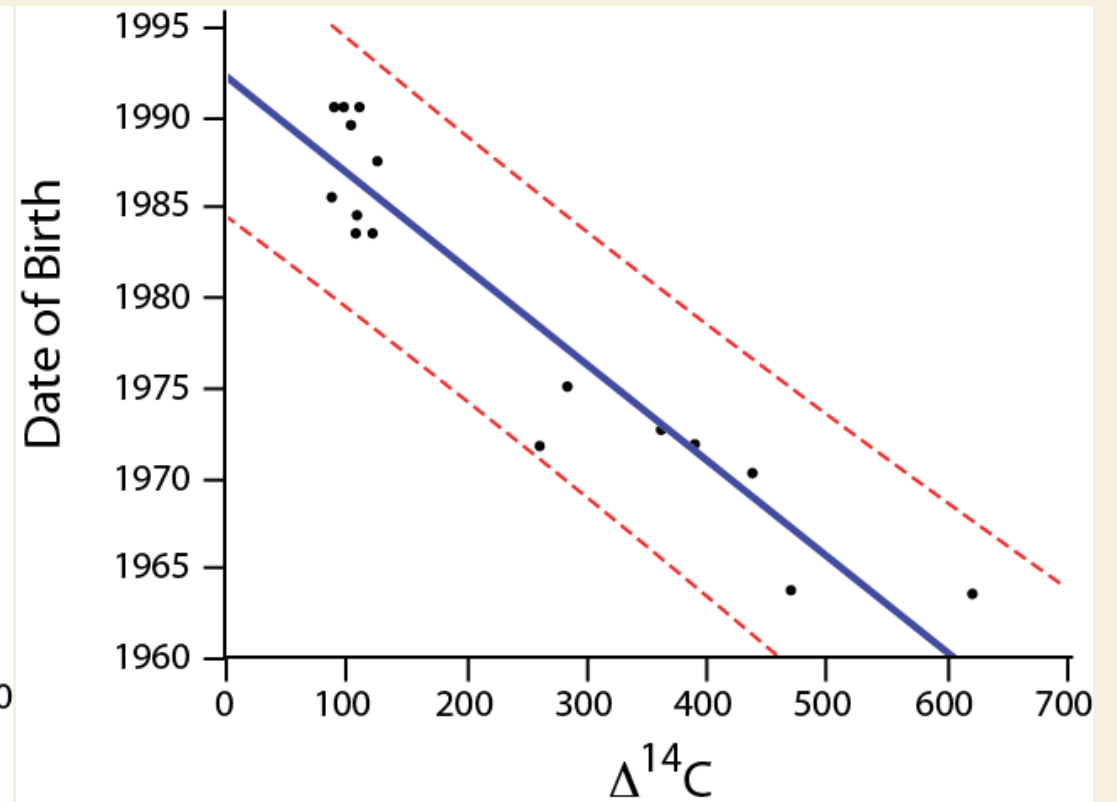


# CONFIDENCE INTERVALS FOR PREDICTIONS OF:

## MEAN $\bar{Y}$



## INDIVIDUAL $Y$



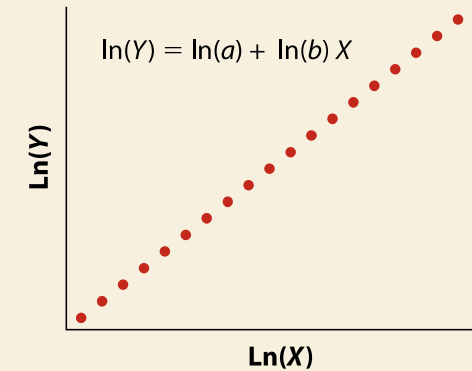
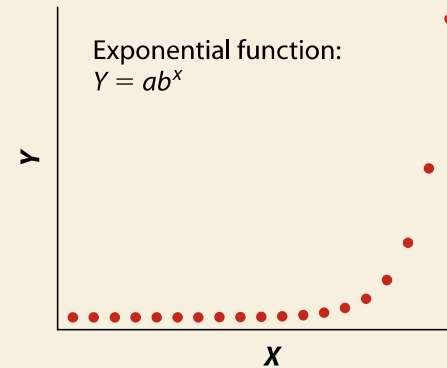
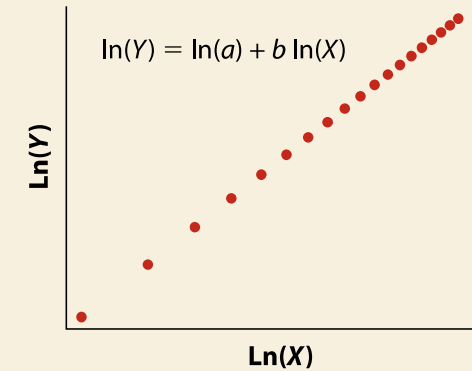
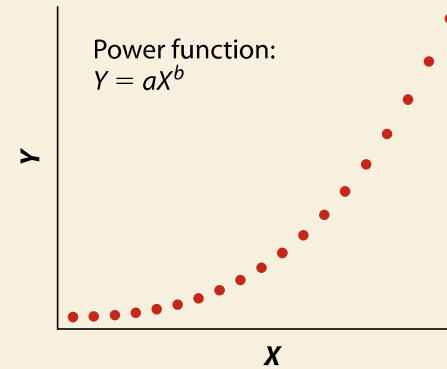
# TRANSFORMATIONS

If  $Y = aX^b$  then  $\ln Y = \ln a + b \ln X$ .

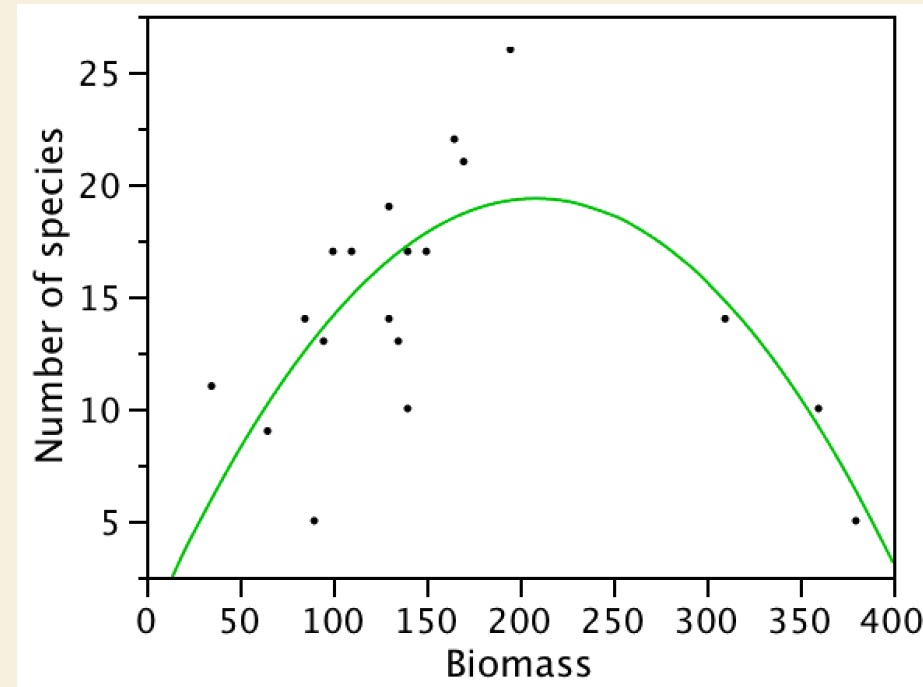
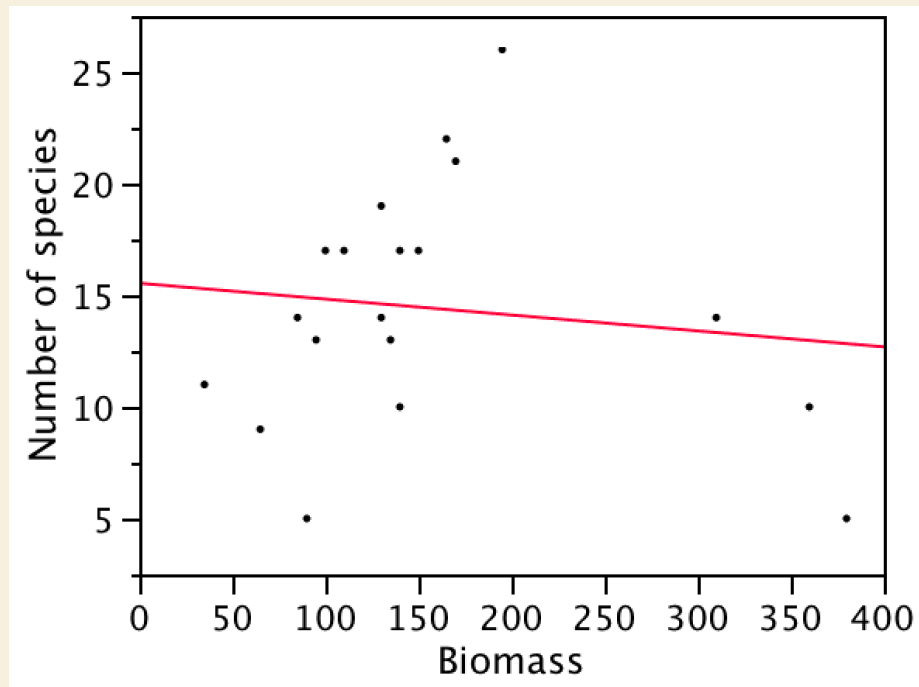
If  $Y = ab^X$  then  $\ln Y = \ln a + X \ln b$ .

If  $Y = a + \frac{b}{X}$  then set  $X' = \frac{1}{X}$ , and calculate  $Y = a + bX'$ .

All of the equations on the right have the form  $Y=a+bX$ .



# POLYNOMIAL REGRESSION



$$\text{Number of species} = 0.046 + 0.185 \text{ Biomass} - 0.00044 \text{ Biomass}^2$$