

Linear Regression

Kin 304W

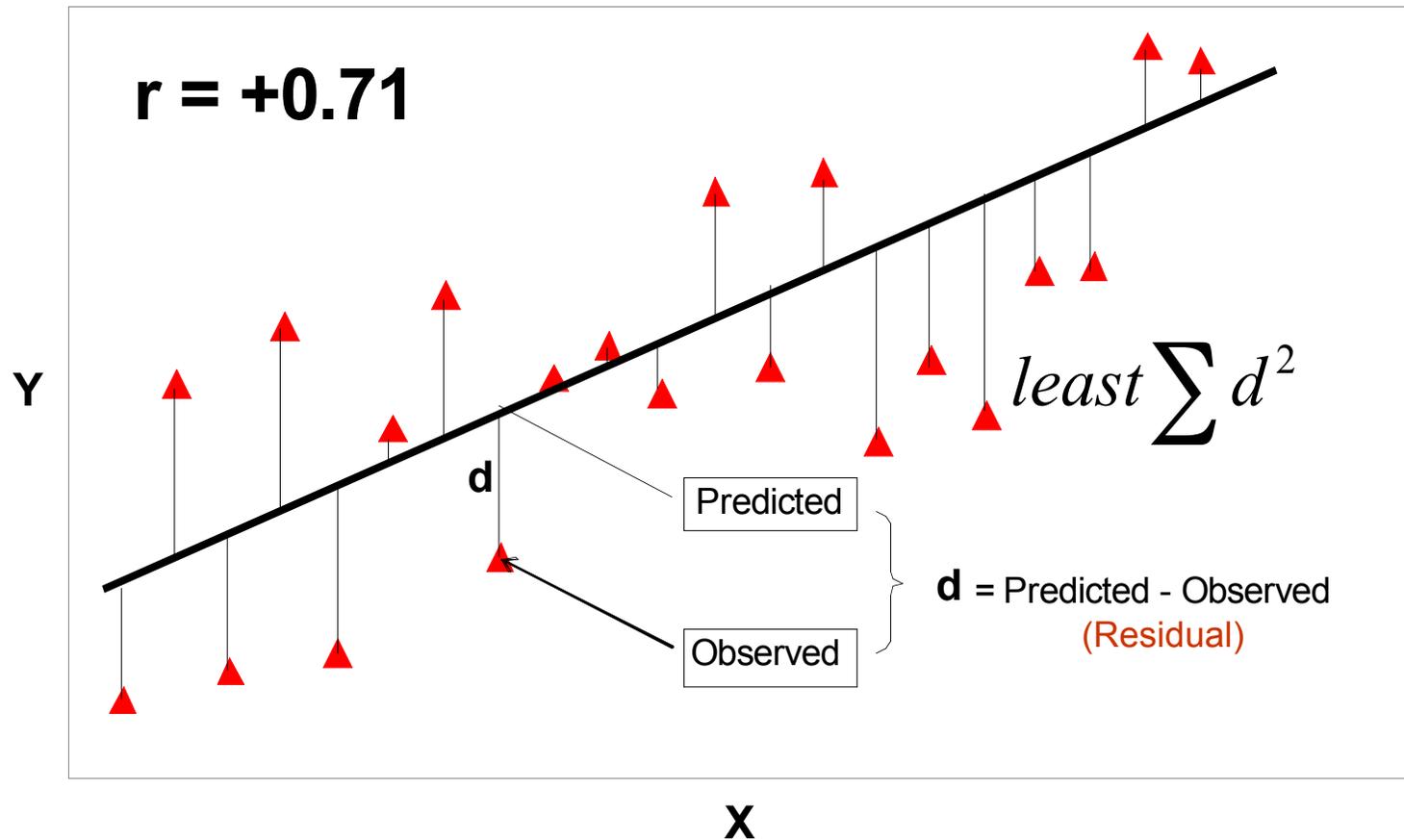
Week 7: February 19, 2013

Think about the courses you have taken and work experiences you have had. What types of **prediction equations** have you seen or used before?

Linear Regression Allows Us To Do Prediction

- Research questions are sometimes framed as, “can we predict one variable from another?”
- Linear regression analysis
 - Fits a line, with a specific equation, to data
 - Software searches for the best fitting line
- **$Y = mX + c$**
 - m** = slope (“coefficient”)
 - c** = intercept (“constant”)

Least Sum of Squares Curve Fitting



Output from Linear Regression

- Correlation Coefficient (r)
 - how well the line **fits**
- Standard Error of Estimate (S.E.E.)
 - how well the line **predicts**

Standard Error of Estimate

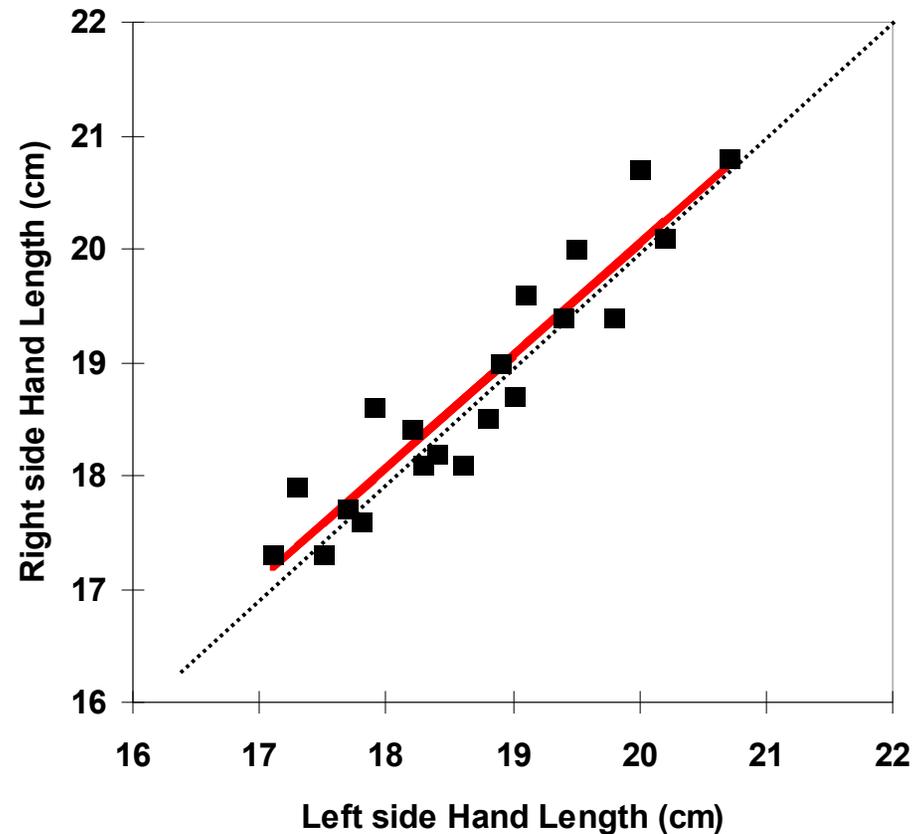
- Measure of how well the equation **predicts** Y
- Has **units of Y**
- 68.26% of time (~2/3 times) the **true score** is within plus or minus 1 S.E.E. of **predicted score**
- 95% of time the true score is within plus or minus 1.96 S.E.E.s
- The S.E.E. is the standard deviation of the normal distribution of residuals

Linear Regression Example 1

Equation: Right Hand Length = 0.99 x Left Hand Length + 0.25

$r = 0.94$

SEE = 0.38 cm



Linear Regression Example 2

- Resting metabolic rate (RMR) is the body's resting energy expenditure.
- Participants have to be fasting and rest for 30 minutes immediately before measurement. Then RMR is measured via indirect calorimetry with a gas exchange hood for 40 minutes. Expensive + time-consuming.
- Fortunately, there are prediction equations for RMR:
 - RMR for men (kcal/day) = $(13.75 \times \text{WT in kg}) + (5 \times \text{HT in cm}) - (6.76 \times \text{AGE in years}) + 66$
 - RMR for women (kcal/day) = $(9.6 \times \text{WT in kg}) + (1.8 \times \text{HT in cm}) - (4.7 \times \text{AGE in years}) + 655$

} Harris-Benedict Equations



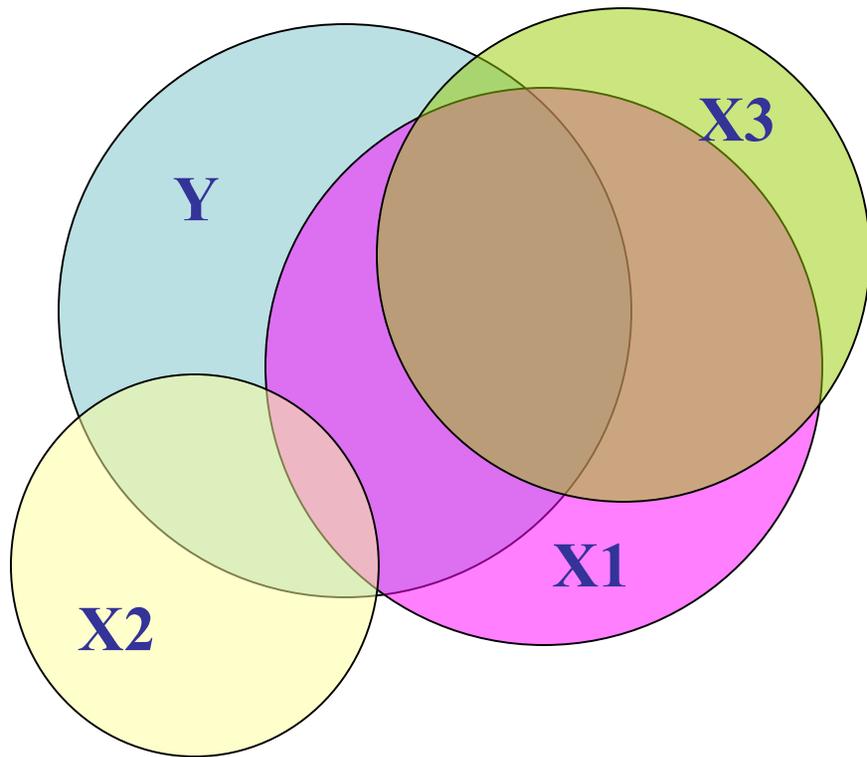
How Good Is My Equation?

- Regression equations are sample specific.
- Cross-validation studies
 - Develop your regression equation using one sample.
 - Test your equation on a different sample. Is the S.E.E. different?
- Split sample studies
 - Take a 50% random sample and develop your equation then test it on the other 50% of the sample.

Multiple Linear Regression

- Simple linear regression has one independent variable
- Multiple linear regression, more than one independent variable
- $Y = m_1X_1 + m_2X_2 + m_3X_3 \dots\dots + c$
- We call the m values “coefficients” rather than slopes.
- We call the c value a “constant” or “intercept.”
- Same meaning for r , and S.E.E., just more measures are used to predict Y
- There are different ways to build a multiple regression equation:
 - Enter method (SPSS default) - force all variables into one equation
 - Stepwise regression - variables are entered into the equation based upon their relative importance

Building a Multiple Regression Equation



Goal is to explain the most variance in Y.

X1 has the highest correlation with Y; therefore it would be the first variable included in the equation.

X3 has a higher correlation with Y than X2.

However, X2 would be a better choice than X3 to include in an equation with X1 to predict Y.

X2 has a low correlation with X1 and explains some of the variance that X1 does not.

Standardized Linear Regression

- In regular linear regression, the numerical value of m_n is dependent upon the size (units) of the independent variable
 - $Y = m_1X_1 + m_2X_2 + m_3X_3 \dots\dots + c$
 - If X_1 was height in meters and $m_1 = 1.0$, what would happen to m_1 if height was in centimeters?
- In standardized regression, variables are transformed into standard z scores (using internal norms) before regression analysis; therefore mean and standard deviation of all independent variables are 0 and 1 respectively.
- The numerical value of zm_n now represents the **relative importance** of that independent variable to the prediction
 - $Y = zm_1X_1 + zm_2X_2 + zm_3X_3 \dots\dots + c$