# Lecture 10 Cogsci 109

## Fri. Oct. 19, 2007 Computing Basic Statistics II, variability

## **Outline for today**

### Announcements

- A few matlab tips
  - Ctrl-I
  - Close all

  - About 'loading data into a variable of your choosing'
- The concept of probability density functions (PDF) reviewed
  - The normal distribution is a PDF

## Announcements

## Reading

- Monday, more reading will be assigned
- Recordings will post first two weeks for those who added late

## Matlab tips

- Ctrl-I
- Close all, close
- Clf
- Loading data into a variable of your choosing issue

# **Outline for today II**

Measures of variability in terms of the normal distribution

### Variance

Definition, properties, applications, how to compute in matlab

#### Standard deviation

 Definition, properties, applications, comparison to variance, computing in matlab

#### Covariance

 Definition, properties, applications, relationship to variance, computing in matlab

#### Z scores and normalizing to unit variance

- How to perform this normalization
- What are the applications and situations one might use this

## **Consider the following...**

- Both signals have the same mean, but they are obviously different!
- One VARIES much more about the mean, can we create a quantitative measure of this?



# We need a measure of Variability, here are a few...

- Range
  - From math review, difference between max and min values of the data

$$Range(x) = Max(x) - Min(x)$$

- Variance
  - Mean of squared deviations from the mean
  - In square units of the sample variable
- Standard deviation
  - Square root of variance
  - □ In units of the sample variable sometimes easier to interpret

# Returning to the normal distribution...and considering our data in terms of a

### histogram...

- The distribution of points about the mean can be considered in terms of probabilities
- How likely is a point to deviate from the mean?
- We call the normal distribution a *probability density function (PDF)* because it allows us to predict the likelihood that a sample will take on a particular value



Histogram of noisy data from previous slide



## Variance

- Whereas the mean defines a measure for the most likely point in state space (the center 'location' of a normal distribution)
- We can define the spread of the normal distribution about the mean by its *variance*



# Variance (part II)

- Steps to compute the variance
  - Compute the deviations from the mean for all the data

$$d_i = \left(x_i - \overline{x}\right)$$

Compute the square of each of the deviations

$$sd_i = \left(d_i\right)^2$$

□ Sum up all these squared deviations

$$ssqd = \sum_{i=1}^{N} (sd_i)$$

Divide the mean squared deviations by N, the number of observations

$$Var = \frac{ssqd}{N}$$

# How to compute the variance in matlab

- Function var()
- Example
- Matlab help: *help var*

# **Standard Deviation**

- Typical 'deviation' from the mean
- Ie how far on average scores depart on either side from the mean
- Easy to compute after the variance just take the square root of the variance

$$SD = \sqrt{Var} = \sqrt{\frac{\sum (x_i - \overline{x})^2}{N}}$$
$$\overline{x} = \frac{\sum x_i}{N}$$

# How to compute the standard deviation in matlab

- Function std()
- Example
- Matlab help: help std

## Z scores

- A Z score is simply a measure of how many standard deviations away from the mean a score is
- Units are standard deviations

$$Z_i = \frac{X_i - \mu}{SD}$$

## Covariance

- Covariance is very commonly used in statistical analysis as the basis for advanced statistics
- Gives a quantitative measure of the relationship between two variables

$$Cov(X,Y) = E\left[\left(X - \mu_x\right)\left(Y - \mu_y\right)^T\right]$$
  

$$E = expectation$$
  

$$\mu = mean$$

## **More Covariance**

■ If the two variables are independent, the covariance is 0

#### (BUT IF COVARIANCE IS 0 THAT DOESN'T MEAN THE VARIABLES ARE INDEPENDENT!!!)

 If they are totally dependent the covariance of data, can be arbitrarily large

#### □ (AGAIN THE CONVERSE IS NOT NECESSARILY TRUE)

- The diagonals are the variance of each variable
- If each row is an observation, and each column a variable...

$$\operatorname{cov}(X) = \left(\frac{1}{N-1}\right) (X - mean(X)) (X - mean(X))^{T}$$

## Matlab does it easily with

- Function: cov(X) where X is a matrix with rows being observations, columns being variables
- cov(X) where X is a vector yields the variance (a single scalar number)

## As an aside: be careful about 'sample' vs. 'population' measures

- You can't usually measure every possible subject or situation
  - Can you measure the height of every SINGLE individual in the United States?
    - Theoretically yes but it would take too long and too many resources
  - Measure a representative group which is large enough to minimize the bias due to the fact that it is only a portion of the total possible measurements you could make
  - Can make some mathematical adjustments
    - We won't deal with this too much, since you learned about this in statistics, but you should know about the implications of each type of measure
- Matlab uses different equations to compute these statistics depending on you, but it has defaults of typically estimating populations

## Trace

 Sum of the variances (the sum of the elements of the diagonal of the covariance matrix)