Standard Deviation and Linear Regression

Let us begin by examining the standard deviation formulas. There are two sets of formulas that you can use to determine the standard deviation. The first set uses the squared deviations from the mean, $s = \sqrt{\frac{\sum (x_k - \overline{x})^2}{n-1}}$ and

$$
\sigma = \sqrt{\frac{\sum (x_k - \mu)^2}{N}}
$$
, and the second set uses the sum of the data values, $\sum x_k$, and the sum of the squares of the data

values,
$$
\sum x_k^2
$$
, $s = \sqrt{\frac{n \sum x_k^2 - (\sum x_k)^2}{n(n-1)}}$ and $\sigma = \sqrt{\frac{N \sum x_k^2 - (\sum x_k)^2}{N^2}}$.

The advantage to using the first set of formulas is that you can determine if you have calculated the mean correctly by examining $\sum (x_k - \overline{x})$ and $\sum (x_k - \mu)$, respectively. Since the necessary sums are easier to determine using a table, you can construct a table that has columns for x_k , $(x_k-\overline{x})$, and $(x_k-\overline{x})^2$, for determining the sample standard deviation and x_k , $(x_k - \mu)$, and $(x_k - \mu)^2$, for determining the population standard deviation. The disadvantage to using the first set of formulas is that you CANNOT round any values used in intermediate calculations. So, that means that when you determine the deviations from the mean, $(x_k - \overline{x})$ or $(x_k - \mu)$, you CANNOT round *any* of these values and when you square these values to determine the squared deviations from the mean, $(x_k - \overline{x})^2$ or $(x_k - \mu)^2$, you CANNOT round *any* of these values either: you must keep all decimal places for determining the sum of the deviations from the mean, $\sum (x_k - \overline{x})$ or $\sum (x_k - \mu)$, and the sum of the squared deviations from the mean, $\sum (x_k - \overline{x})^2$ or $\sum (x_k - \mu)^2$. Since the mean may not be a whole number or be a terminating decimal value, this means that you will have many decimal places to record and, of course, that means that there are many opportunities to record values incorrectly by omitting or switching digits.

The second set of formulas,
$$
s = \sqrt{\frac{n \sum x_k^2 - (\sum x_k)^2}{n(n-1)}}
$$
 and $\sigma = \sqrt{\frac{n \sum x_k^2 - (\sum x_k)^2}{N^2}}$, provide a solution to the problem or

recording all decimal places as well as sums that have many decimal places since using these formulas only require you to determine the sum of the data values, $\sum x_k$, and the sum of the squares of the data values, $\sum x_k^2$. Making a table to organize the necessary values and to use to determine the necessary sums is simpler as well since you need only a column for the original data values, x_k , and a column for the squares of the data values, x_k^2 . Since the data values, x_k , have a fixed number of data values, their squares, x_k^2 , will have a fixed number of data values as well; the number of decimal places in the squares of the data values, x_k^2 , is twice as many as in the original data values. So, the required sums, the sum of the data values, $\sum x_k$, and the sum of the squares of the data values, $\sum x_k^2$, each have a fixed number of decimal places. The second set of formulas have no disadvantage since they are always easy to use. An added advantage is their similarity to the simplest of the regression formulas. We will explore these similarities shortly.

So, having discussed the formulas, it would be nice to explore an example. To that end, it is important to use data with a reasonable number of data values so that you will understand the advantages and disadvantages of these formulas. Let us consider the Nursing Home Data, [http://lib.stat.cmu.edu/DASL/Datafiles/nursinghomedat.html,](http://lib.stat.cmu.edu/DASL/Datafiles/nursinghomedat.html) available on the Data and Story Library (DASL) web site [http://lib.stat.cmu.edu/DASL/.](http://lib.stat.cmu.edu/DASL/) In order to make sure that you understand the data, please visit <http://lib.stat.cmu.edu/DASL/Datafiles/nursinghomedat.html>to read the description of the data: this will help you to understand the context of the data. Let us consider the annual facility expenditures, in hundreds of dollars, that is provided in the column marked with the heading FEXP. If we want to determine the standard deviation using the first set of formulas then we need to set up and use a table to determine the sum of the data values, the mean of the data values, the deviations from the mean for the data values, the sum of the deviations from the mean for the data values, the squared deviations from the mean for the data values, and the sum of the squared deviations from the mean for the data values. For the second set of formulas, we need to set up and use a table to determine the sum of the data values, the squares of the data values, and the sum of the squares of the data values. Examining these tables, provided for your convenience on the next page, you will see that producing the first table requires more time and attention to detail than producing the second table. To put it mildly, the second set of formulas is easier to use. However, the choice of which set of formulas to use is yours.

Once we have determined the required sums, we are ready to use the formulas to determine the standard deviation. So, suppose that we are only studying these 52 licensed nursing facilities in New Mexico: if we are only studying these 52 licensed nursing facilities in New Mexico then we have data for a population and we must determine the population

standard deviation. So, using the population standard deviation formula from the first set of formulas, $\sigma = \sqrt{\frac{\sum (x_k - \mu)^2}{n}}$ N $\sigma = \sqrt{\frac{\sum (x_k - \mu)^2}{n}}$

we find that

$$
\sigma = \sqrt{\frac{193734422.923077}{52}}
$$

= 1930.1973938667

$$
\approx 1930.2 \text{ hundred dollars}
$$

.

.

Using the population standard deviation formula from the second set of formulas, $\sigma = \sqrt{\frac{N \sum x_k^2 - (\sum x_k)^2}{N}}$ 2

$$
\sqrt{\frac{N\sum x_k^2-\left(\sum x_k\right)^2}{N^2}}\text{ , we find that }
$$

$$
\sigma = \sqrt{\frac{52(615375138) - (148072)^{2}}{(52)^{2}}}
$$

= 1930.1973938667

$$
\approx 1930.2 \text{ hundred dollars}
$$

As we should, we find the same value for the population standard deviation using each formula. Please remember that we record the final value our calculated population standard deviation to one more decimal place than that used in the original data; since the original data is recorded to zero decimal places, we use one decimal place when recording the value of the population standard deviation.

Now, suppose that we are only studying these the 60 licensed nursing facilities in New Mexico but that we only have data for 52 licensed nursing facilities in New Mexico: if we can only use data for 52 of the 60 licensed nursing facilities in New Mexico then we have data for a sample and we must determine the sample standard deviation. So, using the sample

standard deviation formula from the first set of formulas, $s = \sqrt{\frac{\sum (x_k - \overline{x})^2}{n-1}}$, we find that

$$
s = \sqrt{\frac{193734422.923077}{52-1}}
$$

= 1949.0290338941
= 1949.0 hundred dollars

$$
\approx 1949.0 \text{ hundred dollars}
$$

$$
s = \sqrt{\frac{n \sum x_k^2 - (\sum x_k)^2}{n(n-1)}}
$$
, we find that

$$
s = \sqrt{\frac{52(615375138) - (148072)^2}{52 \cdot (52-1)}}
$$

= 1949.0290338941

1949.0 hundred dollars ≈

As we should, we find the same value for the sample standard deviation using each formula. Please remember, just as before, that we record the final value our calculated sample standard deviation to one more decimal place than that used in the original data; since the original data is recorded to zero decimal places, we use one decimal place when recording the value of the sample standard deviation.

You must decide for yourself which set of formulas you prefer to use. You will get the same value for the standard deviation, population or sample, but the amount of work that you do in order to determine the necessary sums will be different. Please remember that you CANNOT round any of the intermediate values used in these calculations: you must record all decimal places.

Now, let us consider the formulas for determining the correlation coefficient, r, and the slope of the least squares line, m. If you are partial to the standard deviation formulas, $s = \sqrt{\frac{\sum (x_k - \overline{x})^2}{n-1}}$ and $\sigma = \sqrt{\frac{\sum (x_k - \mu)^2}{N}}$ N $\sigma = \sqrt{\frac{\sum (x_k - \mu)^2}{n}}$, then you may prefer using

$$
=\frac{\sum\Biggl(\frac{\mathbf{X}_k-\overline{\mathbf{X}}}{s_x}\Biggl)\!\!\Biggl(\frac{\mathbf{y}_k-\overline{\mathbf{y}}}{s_y}\Biggr)}{}
$$

the correlation coefficient formula r

$$
n-1
$$
\n
$$
m = \frac{\sum (x_k - \overline{x})(y_k - \overline{y})}{\sum (x_k - \overline{x})^2}
$$
. However, you will have to determine the quotients $\frac{x_k - \overline{x}}{s_x}$ and $\frac{y_k - \overline{y}}{s_y}$ and their products and its

and the slope of the least squares line formula

sum in order to determine the correlation coefficient as well as $x_k - \overline{x}$ and $y_k - \overline{y}$, and their product and its sum in addition to $(x_k - \overline{x})^2$ and its sum. For each of these, you CANNOT round any intermediate values: you must record and use ALL decimal places. So, using these formulas necessitates a great deal of care in recording values and using these values to calculate the other required values. It is important to note that s_x and s_y are the sample standard deviation for the x-values and the sample standard deviation for the y-values, respectively, and that they CANNOT be rounded: you must use ALL decimal places of these values in your calculations. Once you round/truncate any values, you introduce error: error grows as you perform operations on these values (this is called propagation of error).

In order to help you to see the extent of the work necessary to using the correlation coefficient formula

k k x / (y $x_{k} - \overline{x}$ | $y_{k} - \overline{y}$ s、 儿 s $r = \frac{1}{n-1}$ $\left(x_{k} - \overline{x} \right) \left(y_{k} - \overline{y} \right)$ $=\frac{\sum \left(\frac{x_k-x}{s_x}\right) \left(\frac{y_k-y}{s_y}\right)}{n-1}$, let us consider an example. Suppose we use the Nursing Home Data that we considered

earlier. Since the annual facility expenditures, in hundreds of dollars, depends on the number of beds in the facility, we can take the number of beds in the facility as the explanatory variable and the annual facility expenditures, in hundreds of dollars, as the response variable. Using these variables, we can explore the linear relation between these variables. So, let us examine the table that we would need to create in order to determine the correlation coefficient for this linear

relation using k ^|| ^yk $\frac{x}{y}$, $\frac{y}{y}$ Check out the table on the next page. You will see that we must create seven $x_{k} - \overline{x}$) $y_{k} - \overline{y}$ s、 儿 s r $n - 1$ $\left(x_{k} - \overline{x} \right) \left(y_{k} - \overline{y} \right)$ $=\frac{\sum \left(\frac{x_k-x}{s_x}\right)\left(\frac{y_k-y}{s_y}\right)}{n-1}$

columns in order to determine the one req uired sum, $\sum \left(\frac{x_k - \overline{x}}{s_x} \right) \left(\frac{y_k - \overline{y}}{s_y} \right)$; this sum, 23.47305042, is located at the x s, 儿 s $\big($ $\sum \left(\frac{x_k - x}{s_x}\right) \left(\frac{y_k - y}{s_y}\right)$

bottom of the seventh column Please take careful note of all the decimal places that must be recorded and carefully consider if you are up to the task if you plan to use this formula for the correlation coefficient. Having determined the necessary sum, we can then determine the correlation coefficient.

$$
r = \frac{23.47305042}{52}
$$

= 0.460255891
\$\approx 0.5

It is important to remember that the linear correlation coefficient tells us the strength of the linear relation and that the correlation coefficient has no units. So, for licensed nursing facilities in New Mexico, there is a weak linear relation between the number of beds in the facility and the annual facility expenditures, in hundreds of dollars. In interpreting the correlation coefficient, you may find it helpful to associate the magnitude of the correlation coefficient with grades – 0.5 corresponding to a very weak linear relation, 0.6 corresponding to a weak linear relation, 0.7 corresponding to a relatively strong linear relation, 0.8 corresponding to a strong linear relation, 0.9 corresponding to a very strong linear relation, and 0.99 corresponding to an extremely strong linear relation; of course, we need to use more adjectives as the magnitude of r gets closer to 1. Please keep in mind that the closer to 0 the magnitude of the linear correlation coefficient is, the weaker the linear relation between the variables is. If the linear correlation coefficient is 0 then there is no *linear* relation between the variables; notice that the statement is that there is no *linear relation between the variables* not that there is no relation between the variables.

All right, let us now determine the linear correlation coefficient using the other formula.

If we want to determine the linear correlation coefficient using $r = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n}$ $(\sum X_k)$ $\sqrt{n}\sum Y_k^2 - (\sum Y_k)$ k^yk (∠^k*)*(∠yk $\mathsf{R}_{\mathsf{k}}^2 - \left(\sum \mathsf{x}_{\mathsf{k}}\right)^2 \sqrt{\mathsf{n} \sum \mathsf{y}_{\mathsf{k}}^2 - \left(\sum \mathsf{y}_{\mathsf{k}}\right)^2}$ $n \sum x_k y_k - (\sum x_k)(\sum y_k)$ r $n\sum x_k^2 - (\sum x_k)^2 \sqrt{n} \sum y_k^2 - (\sum y_k^2)^2$ $=\frac{n\sum x_ky_k-1}{n}$ $-(\sum x_k)^2 \sqrt{n} \sum y_k^2$ – $\sum {\sf x}_{{\sf k}}{\sf y}_{{\sf k}}- \bigl(\sum {\sf x}_{{\sf k}}\bigr)\bigl(\sum$ $\sum x_k^2 - (\sum x_k)^2 \sqrt{n} \sum y_k^2 - (\sum$

then we need to

determine $\sum x_k$, $\sum x_k^2$, $\sum y_k$, $\sum y_k^2$, and $\sum x_ky_k$. To do this, we can construct and use a table that has columns for x_k , x_k^2 , y_k , y_k^2 , and x_ky_k ; ordering these columns as x_k^2 , x_k , x_ky_k , y_k , and y_k^2 makes the table easy to complete

and minimizes the amount of confusion when determining x_ky_k since these values are on either side of the column that you are completing (please see the example table provided above). One important thing to notice in this table is that the sums will all involve a fixed number of decimal places unlike the table used with the other formula. In addition, you will use four of these five values, x_k^2 , x_k , x_ky_k , and y_k , to determine the slope for the least squares line if you use

()() () kk k k 2 2 k k n xy x y m nx x [−] ⁼ − ∑ ∑∑ ∑ ∑ and two of these sums, and , if you use k ^x ^k ^y ^k y mx ^b n [−] ⁼ ∑ ∑ k to determine b, the y-

coordinate of the y-intercept, for the least squares regression line.

Let us use
$$
r = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{\sqrt{n \sum x_k^2 - (\sum x_k)^2} \sqrt{n \sum y_k^2 - (\sum y_k)^2}}
$$
 to determine the linear correlation coefficient and compare the result

to that which we obtained using the other formula.

$$
r = \frac{52(15679560) - (4850)(148072)}{\sqrt{52(537472) - (4850)^2} \sqrt{52(615375138) - (148072)^2}}
$$

=
$$
\frac{97187920}{\sqrt{4426044} \sqrt{10074189992}}
$$

= 0.460255891
\approx 0.5

So, as we should, we obtained the same value for the correlation coefficient. You might wonder why one might choose to use this formula over the other formula. Well, we would choose to use this formula due to its similarities the slope for the

least squares line formula,
$$
m = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n \sum x_k^2 - (\sum x_k)^2}
$$
: the numerator for $r = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{\sqrt{n \sum x_k^2 - (\sum x_k)^2} \sqrt{n \sum y_k^2 - (\sum y_k)^2}}$ and $m = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n \sum x_k^2 - (\sum x_k)^2}$ are the same and $n \sum x_k^2 - (\sum x_k)^2$ appears in the denominator of $m = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n \sum x_k^2 - (\sum x_k)^2}$ and in the first square root of the denominator of $r = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n \sum x_k^2 - (\sum x_k)^2}$.

So, due to these similarities, we have already have determined the two values that we need to determine the slope of the least squares line, the values of the numerator and denominator of the fraction.

$$
m = \frac{52(15679560) - (4850)(148072)}{52(537472) - (4850)^{2}}
$$

$$
= \frac{97187920}{4426044}
$$

$$
= 21.95819111
$$

$$
\approx 22.0 \text{ hundred dollars per bed}
$$

Please recall that the units for the slope are the quotient of the y-units and the x-units. Since the response variable is the annual facility expenditures, in hundred dollars, and the explanatory variable is the number of beds in the facility, the yunits are hundred dollars and the x-units are beds, making the slope-units hundred dollars per bed.

Using $b = \frac{\sum y_k - m\sum x_k}{n}$, we can determine the value of b. It is important to note that we already have the necessary sums, $\sum x_k$ and $\sum y_k$.

$$
b = \frac{148072 - \left(\frac{97187920}{4426044}\right)4850}{52}
$$

= 799.5148679

$$
\approx 799.5 \text{ hundred dollars}
$$

Rather than using the value of the slope expressed as a fraction above, we could use the full decimal value,

$$
b = \frac{148072 - (21.95819111)4850}{52}
$$

= 799.5148679

$$
\approx 799.5 \text{ hundred dollars}
$$

Either way, we obtain the same value. However, we CANNOT USE AN APPROXIMATION FOR THE SLOPE in our calculation of b: we CANNOT use 22.0 in our calculation since we cannot round/truncate/approximate intermediate values used in calculations. So, the value of the y-coordinate of the y-intercept is 799.5 hundred dollars and the y-intercept is $(0, 799.5)$; recall that the y-intercept is a point. Combining these last two results, we find that the equation for the least squares line is $y = 22.0x + 799.5$; notice that the values of m and b have been recorded to one decimal place since the original data values have zero decimal places.

The last thing that we will do is interpret the slope and the y-intercept. To interpret the slope, it is important to remember that

$$
m = \frac{\text{change in } y}{\text{change in } x}
$$

=
$$
\frac{\text{change in response variable}}{\text{change in explanatory variable}}
$$

Adding the meaning of our variables, we have

 $m = \frac{change \text{ in the annual facility expenditures}}{change \text{ in the number of beds in the facility}}$

To use this, we must express our slope as a fraction. This is easy to do since all numbers can be expressed as a fraction simply by putting a 1 in the denominator.

> $m = 22.0$ hundred dollars bed 22.0 hundred dollars 1 bed 22.0 hundred dollars $=\frac{22.0 \text{ minutes}}{1 \text{ bed}}$ =

Combining these two ideas, we find that the numerator is a positive change, an increase by 22.0 hundred dollars or a 22.0 hundred dollar increase, and the denominator is a positive change, a 1 bed increase or an increase by 1 in the number of beds. So, adding the context as well as the variables and the dependence of the annual facility expenditures on the number of beds, we can write a sentence that interprets the slope.

Here are three interpretations of the slope:

- (i) For licensed nursing facilities in New Mexico, for each additional bed in a facility, the annual facility expenditures increases by 22.0 hundred dollars.
- (ii) For licensed nursing facilities in New Mexico, if the number of beds in the facility is increased by 1 then the annual facility expenditures increases by 22.0 hundred dollars.

(iii) For licensed nursing facilities in New Mexico, for each additional bed in a facility, there is a 22.0 hundred dollar increase in the annual facility expenditures.

If the slope is negative then we keep the negative in the numerator and use the word decrease in the interpretation since a negative change is a decrease.

For the interpretation of the y-intercept, (0, 799.5), we must remember that the x-value is the number of beds in the facility and that the y-value is the annual facility expenditures. With this in mind, all we need to do is make sure that our interpretation includes the dependence of the annual facility expenditures on the number of beds in the facility and the context for the data.

Here are three interpretations for the y-intercept:

- (i) For licensed nursing facilities in New Mexico, the annual facility expenditures for a facility having zero beds is 799.5 hundred dollars.
- (ii) For licensed nursing facilities in New Mexico, a facility having zero beds has annual facility expenditures of 799.5 hundred dollars.
- (iii) The annual facility expenditures for licensed nursing facilities in New Mexico with zero beds is 799.5 hundred dollars.

All interpretations for the slope m must include the dependence of the response variable on the explanatory variable as well as the idea of an increase or decrease in the value of the response variable for a unit (1) increase in the value of the explanatory variable. Interpretations of the y-intercept must include the dependence of the response variable on the explanatory variable. Each interpretation must include the context for the data.

Recommended formulas for use:

Sample Standard Deviation:
$$
s = \sqrt{\frac{n \sum x_k^2 - (\sum x_k)^2}{n(n-1)}}
$$

Population Standard Deviation: $\sigma = \sqrt{\frac{N \sum x_k^2 - (\sum x_k)^2}{N^2}}$ 2 $N\sum_{k} x_{k}^{2} - (\sum_{k} x_{k})$ N $\sigma = \sqrt{\frac{N\sum x_k^2 - (\sum x_k^2 - (\sum x_k^2 + \sum y_k^2 + \sum y_k^2 + \sum z_k^2 + \$

Slope for the Least Squares Regression Line: $m = \frac{n \sum x_k y_k - (\sum x_k)(\sum y_k)}{n}$ $(\sum x_{k})$ k^yk (∠^k*)*(∠yk $k^{2} - (\sum x_{k})^{2}$ $n \sum x_k y_k - (\sum x_k)(\sum y_k)$ m $n\sum x_k^2 - (\sum x_k)$ $=\frac{n\sum x_k y_k -$ − $\sum {\sf x}_{\sf k} {\sf y}_{\sf k}$ – $\bigl(\sum {\sf x}_{\sf k}\bigr)\bigl(\sum$ $\sum x_k^2 - (\sum$

$$
\text{Correlation Coefficient:} \quad r = \frac{n\sum x_k y_k - \big(\sum x_k\big)\big(\sum y_k\big)}{\sqrt{n\sum x_k^2 - \big(\sum x_k\big)^2}\sqrt{n\sum y_k^2 - \big(\sum y_k\big)^2}}
$$

Y-Coordinate of the Y-Intercept for the Least Squares Regression Line: $b = \frac{\sum y_k - m\sum x_k}{n}$

Equation for the Least Squares Regression Line: $y = mx + b$ where you substitute in the values of m and b

Convenient table set up – order for columns: x_k^2 , x_k , x_ky_k , y_k , and y_k^2