## Multiple Regression -- Predicting a Quantitative Criterion Using 2 or More Quantitative (or Binary) Predictors

Application: To identify how multiple predictors contribute to the the linear equation relating the predictors to the criterion.

Research Hypothesis: There is the implicit hypothesis that the multivariate model significantly predicts the criterion. There might also be hypotheses about which predictors do and do not contribute to the multivariate model

## Start with the Correlations!

It is a good idea to examine the correlations among the variables you plan to include in the multiple regression equation before performing the multiple regression analyses.
The criterion variable for this analysis will be the rating of fish quality. The two predic-
Correlations

|  |  | rating of fish <br> quality <br> $1-10$ scale | type of fish <br> available | number of <br> fish at store |
| :--- | :--- | ---: | ---: | ---: |
| rating of fish quality - | Pearson Correlation | 1 | $.595^{*}$ | $-.707^{*}$ |
| $1-10$ scale | Sig. (2-tailed) | . | .041 | .010 |
|  | N | 12 | 12 | 12 |
| type of fish available | Pearson Correlation | $.595^{*}$ | 1 | -.441 |
|  | Sig. (2-tailed) | .041 | .04 | .151 |
|  | N | 12 | 12 | 12 |
| number of fish at store | Pearson Correlation | $-.707^{*}$ | -.441 | 1 |
|  | Sig. (2-tailed) | .010 | .151 | . |
|  | N | 12 | 12 | 12 | tors will be the typw of fish available (a binary variable with the values $1=$ freshwater only \& 2 = fresh- and saltwater.

The correlation matrix shows that there is a significant positive correlation between ratings of fish quality and type of fish available in the stores. The interpretation of this is that the stores with fresh- and saltwater fish (with the higher code =1) have a significantly higher mean fish quality ratings than stores with only freshwater fish (with the lower code = 0 )

The matrix shows a significant negative correlation between ratings of fish quality and number of fish at the stores. The interpretation of this is that stores with more fish tended to have lower fish quality ratings.

On to the multiple regression...
*. Correlation is significant at the 0.05 level (2-tailed).

## Analyze $\rightarrow$ Regression $\rightarrow$ Linear

- Highlight the criterion variable and click the arrow to move it into the "Dependent" box
- Highlight the predictor variables and click the arrow to move them into the "Independent(s)" box
- Click "Statistics" -- in the Linear Regression: Statistics window be sure "Estimates" and "Model fit" are checked



## Linear Regression: Statistics

-Regression Coefficients
$\sqrt{\checkmark}$ Estimates
$\Gamma$ Confidence intervals
$\Gamma$ Coyariance matrix
$\nabla$
$\Gamma$
Model fit
R squared change

- Descriptives
$\Gamma$ Part and partial correlations
$\Gamma$ Collinearity diagnostics



## Residuals

$\Gamma$ Durbin-Watson
$\Gamma$ Casewise diagnostics

The $R$ is the multiple correlation coefficient.
$R^{2}$ tell the proportion of the criterion variable's variation is accounted for by the predictor

The ANOVA provides the significance test of the H 0 : that $\mathrm{R}^{2}=0$ (or $\mathrm{R}=0$ ).
a. Predictors: (Constant), number of fish at store, type of fish available

ANOVA ${ }^{b}$

| Model |  | Sum of <br> Squares | df | Mean <br> Square | F | Sig. |
| :--- | :--- | ---: | ---: | ---: | :--- | :--- |
| 1 | Regression | 31.719 | 2 | 15.859 | 6.733 | $.016^{\text {a }}$ |
|  | Residual | 21.198 | 9 | 2.355 |  |  |
|  | Total | 52.917 | 11 |  |  |  |

a. Predictors: (Constant), number of fish at store, type of fish available
b. Dependent Variable: rating of fish quality - 1-10 scale

Coefficients

a. Dependent Variable: rating of fish quality - 1-10 scale

## Computing predicted criterion scores for new cases

Once you have the multiple regression formula you can use it to predict criterion variable scores for new cases or participants for which you have only predictor variable scores. This is done much as with simple regression, but there will be multiple weighted predictors in te compute statement.

Please note that you must use all of the predictors included in the model, whether they contribute to the model or not -- it is not appropriate to include just a subset of the predictors. If you wish to eliminate predictors that do not contribute to the model you must rerun the model without those predictors and use the resulting regression weights.

## Transform $\rightarrow$ Compute

- Type the name of the predicted criterion variable in the "Target Variable:" box (1-8 characters)
- Type the regression formula into the "Numeric Expression" box

When you press "OK" a variable with the name you specified will be added into the rightmost column of the data editor for each case.


## Write-up

Correlation and multiple regression analyses were used to explore the relationship between fish number, type of fish available and fish quality. Table 1 shows the univariate statistics for these variables.

Table 2 shows the correlation and regression results. Fish quality is significantly negatively correlated with fish qualtiy, indicating that stores with more fish tend to have fish of lower overall quality. Type of fish department was significantly postively correlated with fish quality, revealing that stores with both types of fish tended to have fish of higher overall quality than stores with only freshwater fish.

The multiple regression results show that there is a significant negative relationship between number of fish and fish quality after taking type of fish available into account, however, type of fish available at a store does not contribute to this multivariate model.

Table 1.
Univariate statistics for criterion and predictor variables ( $\mathrm{N}=12$ )

| Variable | Univariate Statistics |  |  |
| :--- | :---: | :--- | :---: |
|  |  |  |  |
| Fish Quality | $M=6.58$ | $S D=2.10$ |  |
| Number of Fish | $M=25.59$ | $S D=9.27$ |  |
| Type of Fish Available | Freshwater Fish |  |  |
|  | Freshwater \& Saltwater Fish | $n=6$ |  |
|  | $n=6$ | $(50 \%)$ |  |
|  |  |  |  |

Table 2.
Correlations and multiple regression weights

| Variable | $r(p)$ | $b(p)$ | $B$ |
| :--- | :--- | :--- | :--- |
|  |  |  |  |
| Number of Fish | $-.707(.01)$ | $-0.131(.04)$ | -.552 |
| Type of Fish Available | $.595(.04)$ | $1.447(.17)$ | .352 |
| $\quad$ constant |  | 9.158 |  |

