## Clinical Biostatistics

## Correlation

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## Correlation

Example: Muscle strength and height in 42 alcoholics
$\qquad$ A scatter diagram:


How close is the relationship?
Correlation: measures closeness to a linear relationship.

## Correlation coefficient

Subtract means from observations and multiply.

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Sum of products about the means.
Like the sum of squares about the means used for measuring variability.

## Correlation coefficient

Subtract means from observations and multiply.


Products in top right and bottom left quadrants positive.

## Correlation coefficient

Subtract means from observations and multiply.


Products in top right and bottom left quadrants positive.
Products in top left and bottom right quadrants negative.

## Correlation coefficient

Subtract means from observations and multiply.


Sum of products positive.
Correlation positive.

## Correlation coefficient

Example: Muscle strength and age in 42 alcoholics

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## Correlation coefficient

Example: Muscle strength and age in 42 alcoholics

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$\qquad$
Sum of products negative.
Correlation negative.

## Correlation coefficient

Divide sum of products by square roots of sums of squares.
Correlation coefficient, denoted by $r$.
Maximum value $=1.00$.
Minimum value $=-1.00$.
Also known as:
> Pearson's correlation coefficient,
> product moment correlation coefficient.
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## Correlation coefficient

Divide sum of products by square roots of sums of squares.
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Divide sum of products by square roots of sums of squares.
Correlation coefficient, denoted by $r$.
Maximum value $=1.00$.
Minimum value $=-1.00$.

$r=0.42$.
Positive correlation of fairly low strength
Minimum value $=1.00$.
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## Correlation coefficient

Divide sum of products by square roots of sums of squares.
Correlation coefficient, denoted by $r$.
Maximum value $=1.00$.
Minimum value $=-1.00$.


$$
r=-0.42
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Negative correlation of fairly low strength.
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## Correlation coefficient

Positive when large values of one variable are associated with large values of the other.


## Correlation coefficient

Positive when large values of one variable are associated with large values of the other.


## Correlation coefficient

Negative when large values of one variable are associated with small values of the other.

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## Correlation coefficient

Negative when large values of one variable are associated with small values of the other.


## Correlation coefficient

$r=+1.00$ when large values of one variable are associated with large values of the other and the points lie on a straight line.


## Correlation coefficient

$r=-1.00$ when large values of one variable are associated with small values of the other and the points lie on a straight line.

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## Correlation coefficient

$r$ will not equal -1.00 or +1.00 when there is a perfect relationship unless the points lie on a straight line.


## Correlation coefficient

$r=0.00$ when there is no linear relationship.


## Correlation coefficient

It is possible for $r$ to be equal to 0.00 when there is a relationship which is not linear.

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## Correlation coefficient

We can test the null hypothesis that the correlation
$\qquad$ coefficient in the population is zero.
Simple t test, tabulated.
Assume: one of the variables is from a Normal distribution. Large deviations from assumption $\rightarrow P$ very unreliable.
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$r=0.42, \mathrm{P}=0.006$.
Easy to do, simple tables.

Computer programs almost always print this.

## Correlation coefficient

We can find a confidence interval for the correlation $\qquad$ coefficient in the population.
Fisher's z transformation.
Assume: both of the variables are from a Normal distribution. Large deviations from assumption $\rightarrow \mathrm{Cl}$ very unreliable.
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$r=0.42$, approximate 95\% confidence interval: 0.13 to 0.64 Tricky, approximate.
Computer programs rarely print this.
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