



**190F**  
Fall 2018

# Foundations of Data Science

## Lecture 28

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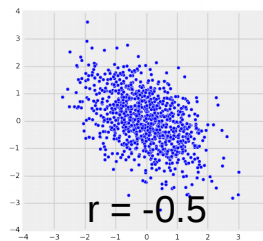
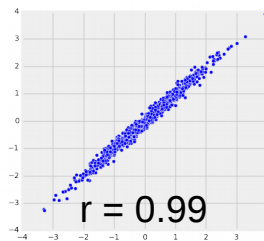
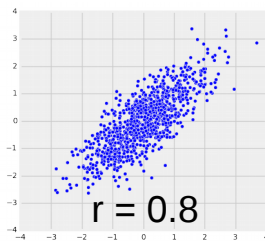
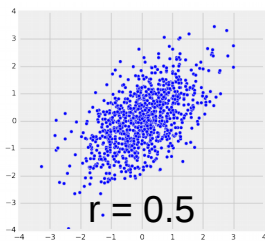
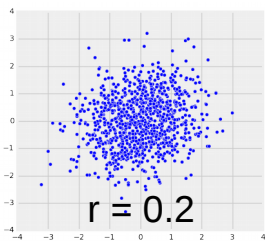
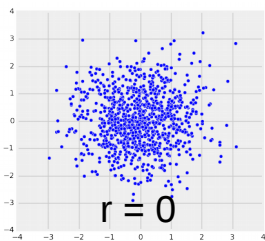
Linear Regression

# **Correlation (Review)**

# The Correlation Coefficient $r$

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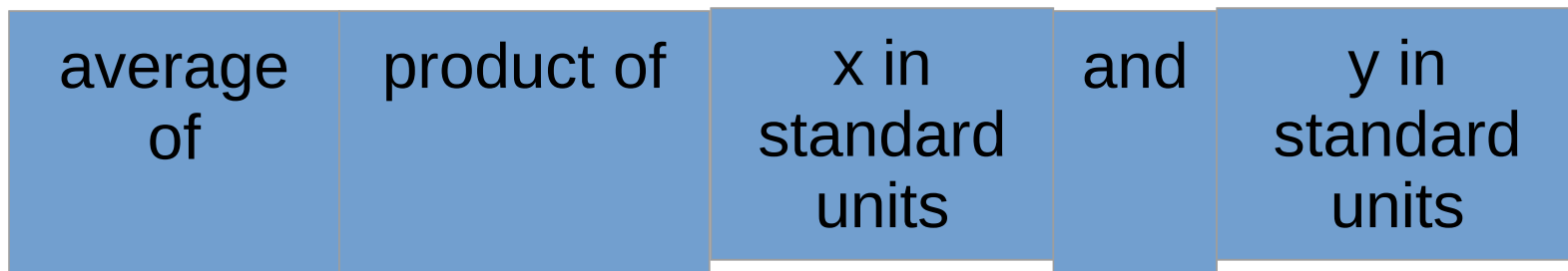
- Measures linear association
- Based on standard units
- $-1 \leq r \leq 1$ 
  - $r = 1$ : scatter is perfect straight line sloping up
  - $r = -1$ : scatter is perfect straight line sloping down
- $r = 0$ : No linear association; *uncorrelated*



# Definition of $r$

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**Correlation Coefficient ( $r$ ) =**



Measures how clustered the scatter is around a straight line

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# **Properties of Correlation**

# Properties of $r$

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- $r$  is a pure number, with no units
  - $r$  is not affected by changing units of measurement
  - $r$  is not affected by switching the horizontal and vertical axes
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# Interpreting $r$

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Watch out for:

- Jumping to conclusions about causality
  - Non-linearity
  - Outliers
  - Ecological correlations, based on aggregates or averaged data
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# Interpreting $r$

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Don't jump to conclusions about causality

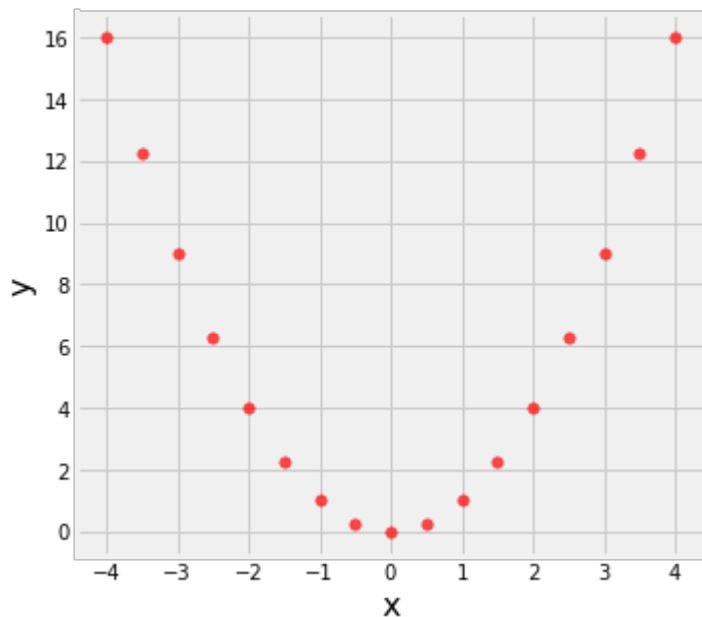
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# Interpreting $r$

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Watch out for non-linearity.

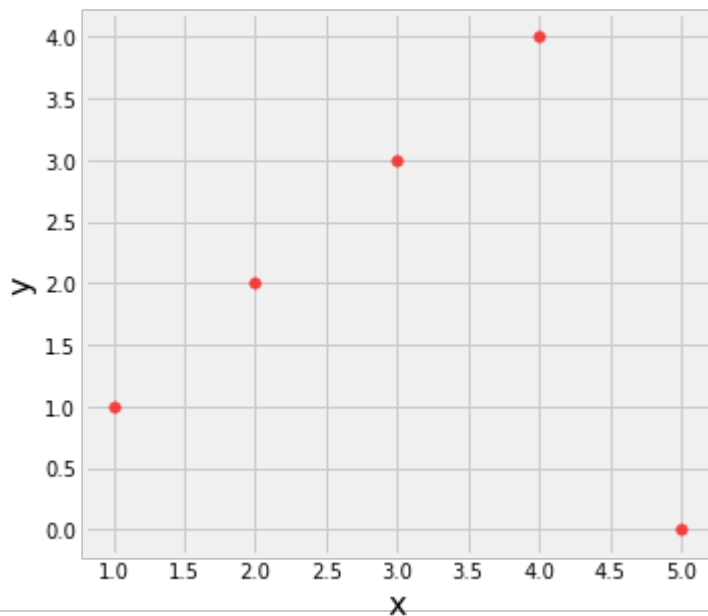


$$r = 0.0$$

# Interpreting $r$

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Watch out for outliers.

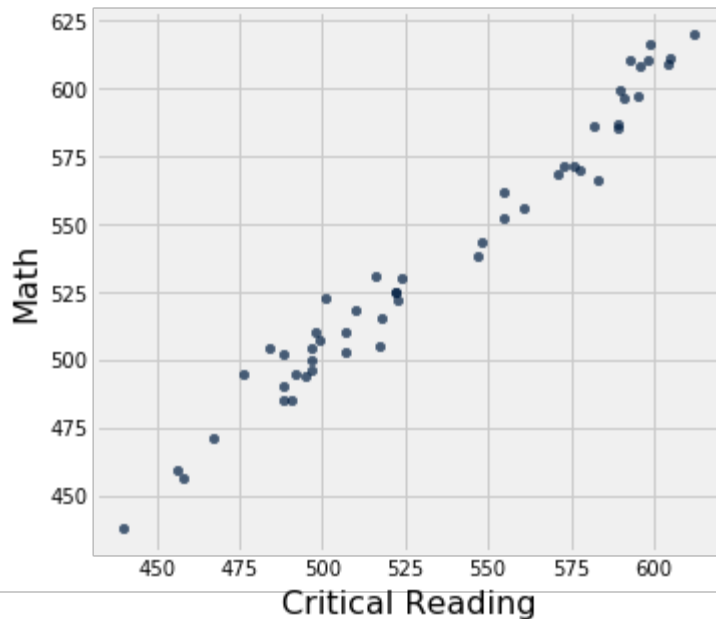


$$r = 0.0$$

# Interpreting $r$

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Watch out for ecological correlations, based on aggregates or averaged data.

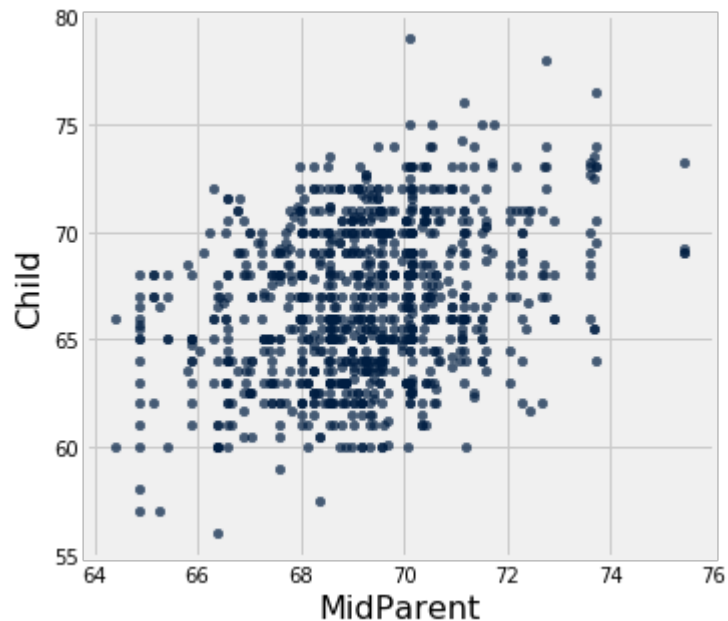


$$r = 0.98$$

**Prediction**

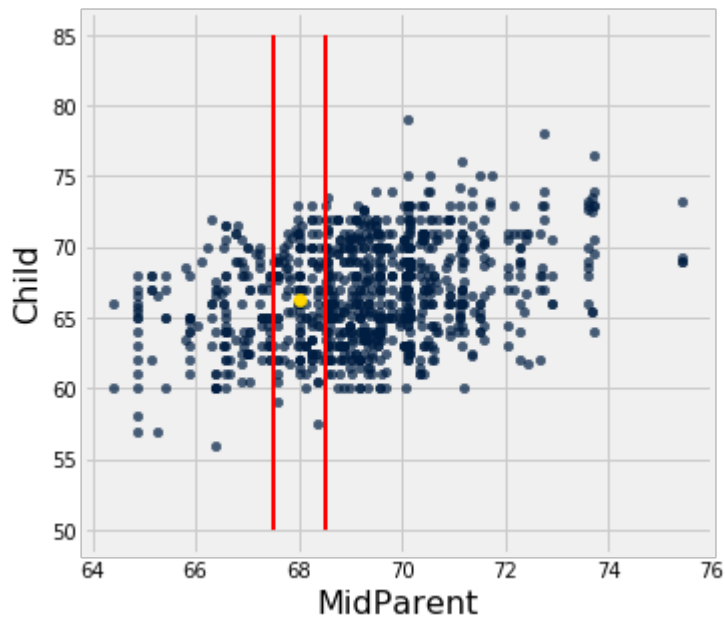
# Galton's Heights

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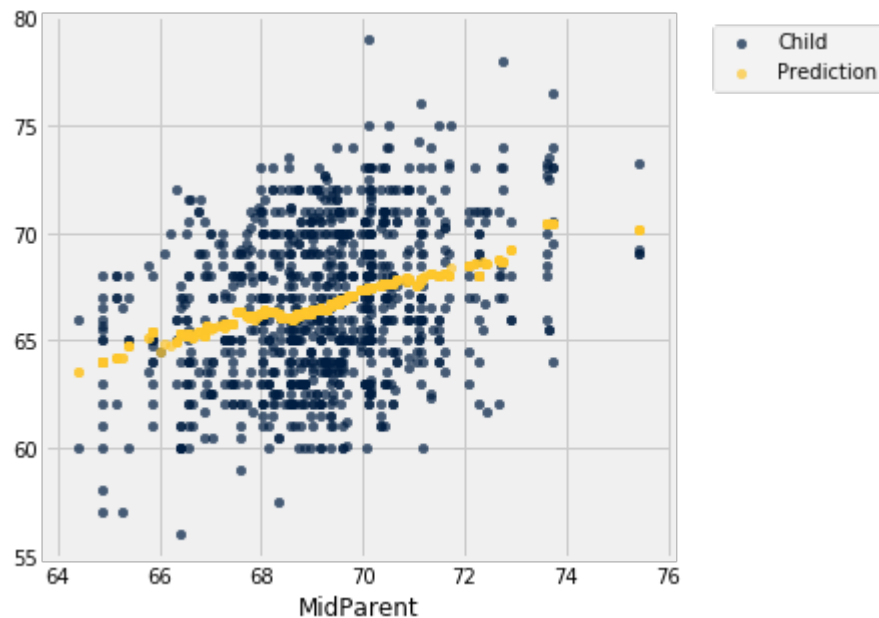
# Galton's Heights

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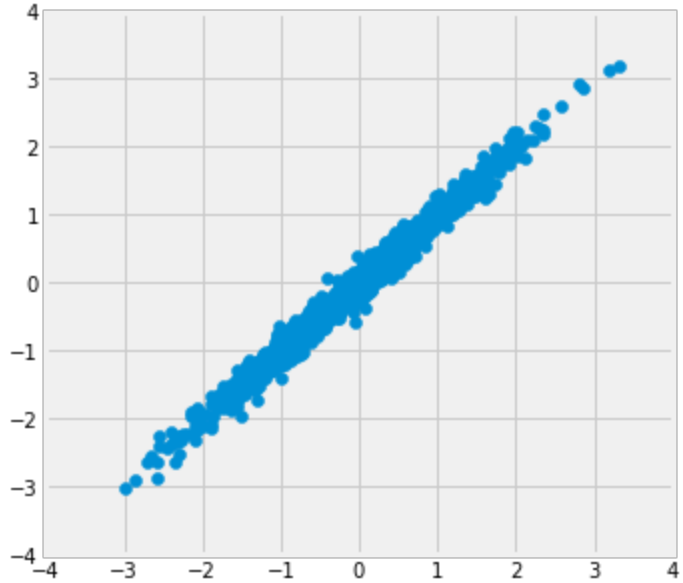
# Galton's Heights

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# Where is the prediction line?

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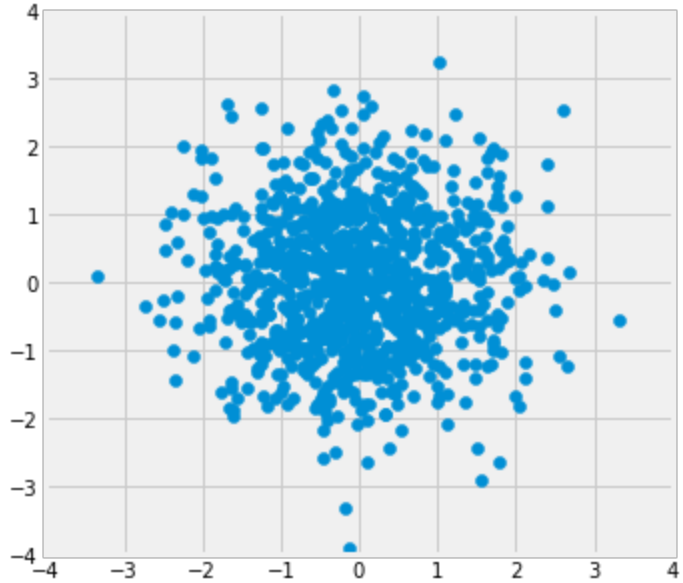
$$r = 0.99$$

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# Where is the prediction line?

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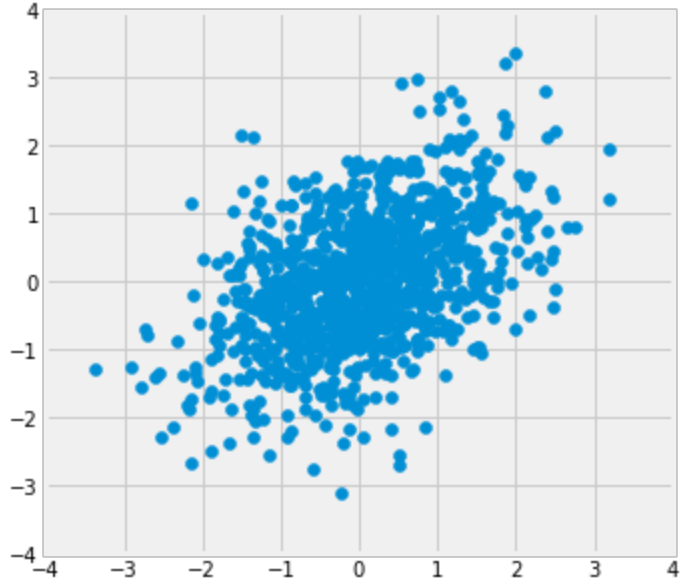


$$r = 0.0$$

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# Where is the prediction line?

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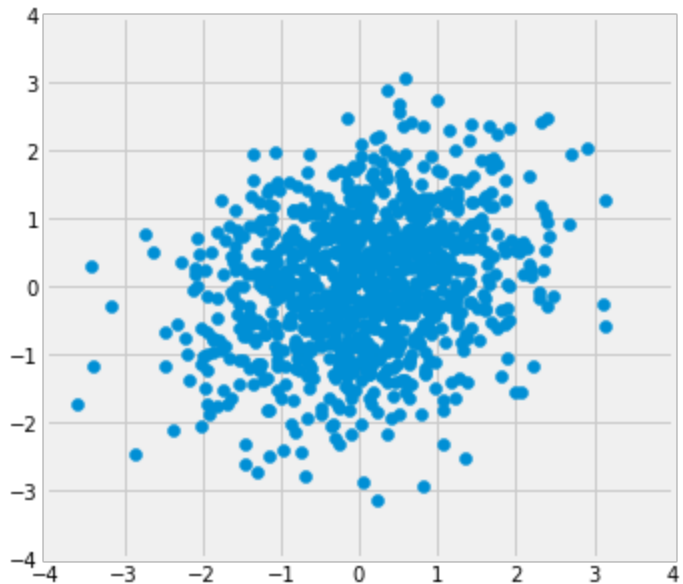


$$r = 0.5$$

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# Where is the prediction line?

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$r = 0.2$

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# Nearest Neighbor Regression

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A method for prediction:

- Group each  $x$  with a representative  $x$  value (rounding)
- Average the corresponding  $y$  values for each group

For each representative  $x$  value, the corresponding prediction is the average of the  $y$  values in the group.

Graph these predictions.

If the association between  $x$  and  $y$  is linear, then points in the graph of averages tend to fall on the regression line.

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# Regression to the Mean

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A statement about  $x$  and  $y$  pairs

- Measured in *standard units*
- Describing the deviation of  $x$  from 0 (the average of  $x$ 's)
- And the deviation of  $y$  from 0 (the average of  $y$ 's)

*On average*,  $y$  deviates from 0 less than  $x$  deviates from 0

Regression  
Line

$$y_{(\text{su})} = r \times x_{(\text{su})}$$

Correlation

Not true for all points — a statement about averages

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# Linear Regression

(Demo)

# Slope & Intercept

# Regression Line Equation

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In original units, the regression line has this equation:

$$\frac{\text{estimate of } y - \text{average of } y}{\text{SD of } y} = r \times \frac{\text{the given } x - \text{average of } x}{\text{SD of } x}$$

y in standard units

x in standard units

Lines can be expressed by *slope* & *intercept*

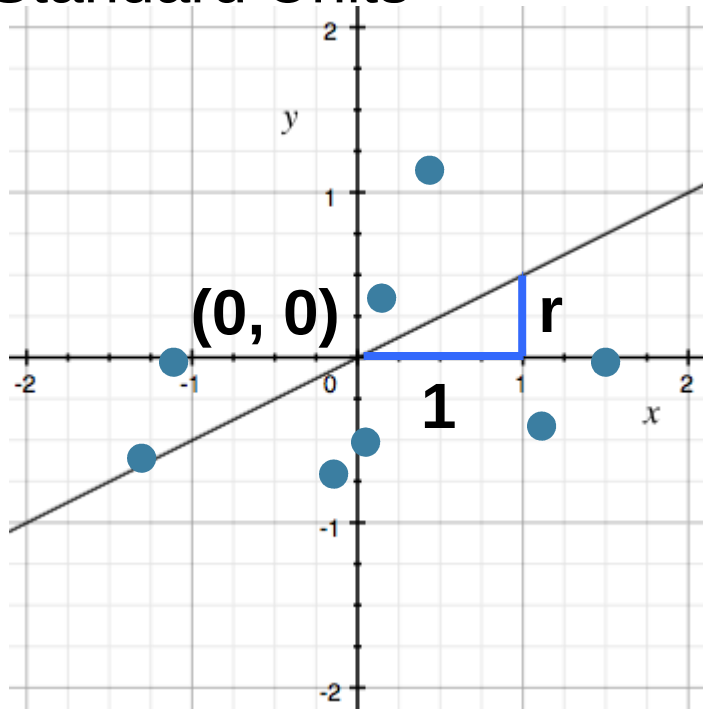
$$y = \text{slope} \times x + \text{intercept}$$

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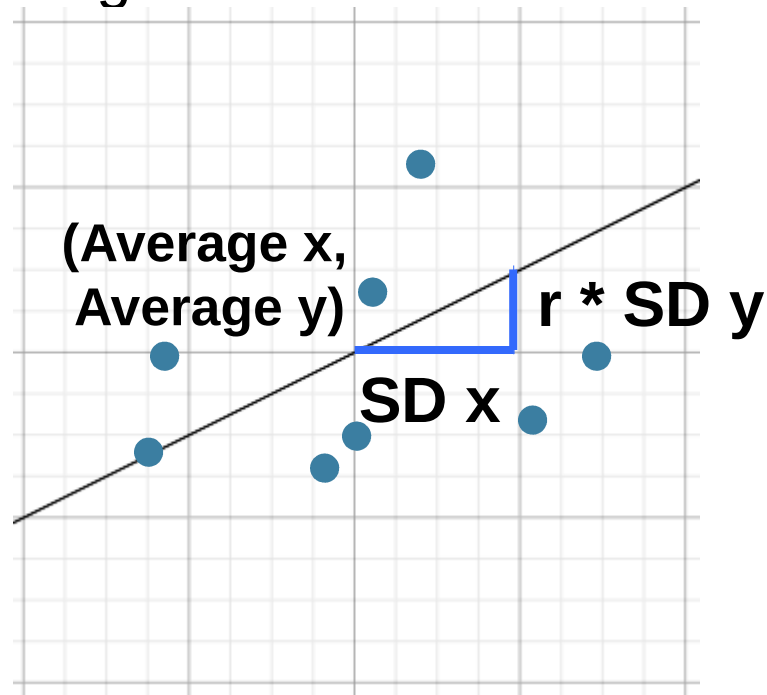


# Regression Line

## Standard Units



## Original Units



# Slope and Intercept

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estimate of  $y$  = slope  $\cdot$   $x$  + intercept

$$\text{slope of the regression line} = r \cdot \frac{\text{SD of } y}{\text{SD of } x}$$

$$\text{intercept of the regression line} = \text{average of } y - \text{slope} \cdot \text{average of } x$$

(Demo)

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