# Introduction to Regression

#### Gaston Sanchez

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# Motivation

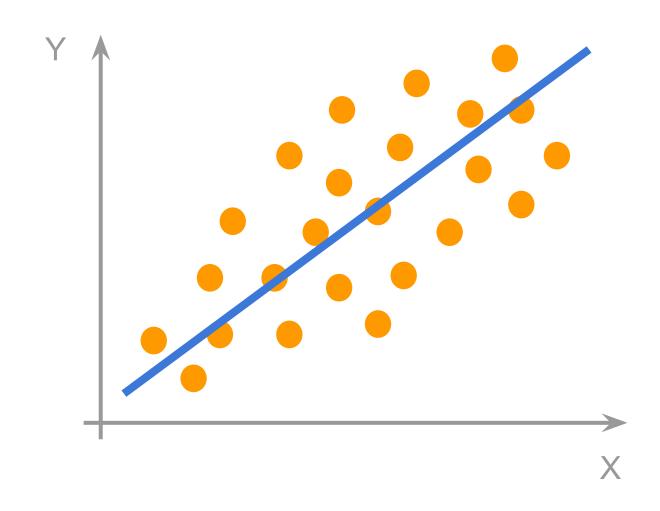
### Regression Idea

Summarize the relationship between X and Y with a linear equation

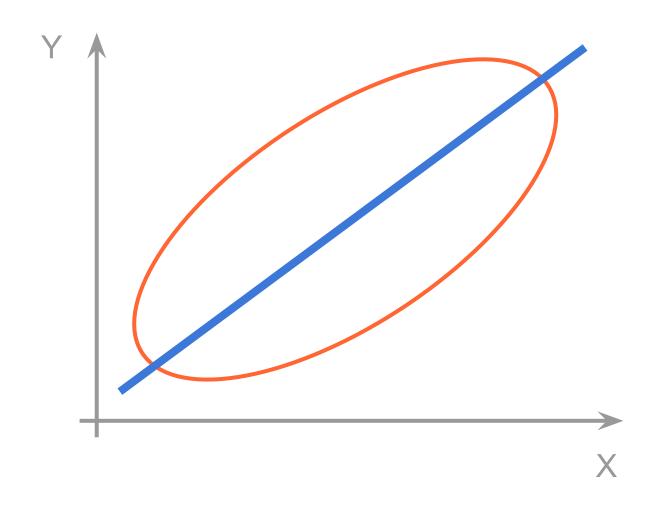
In graphical terms ...

# Represent a cloud of points with a line

# Cloud of points



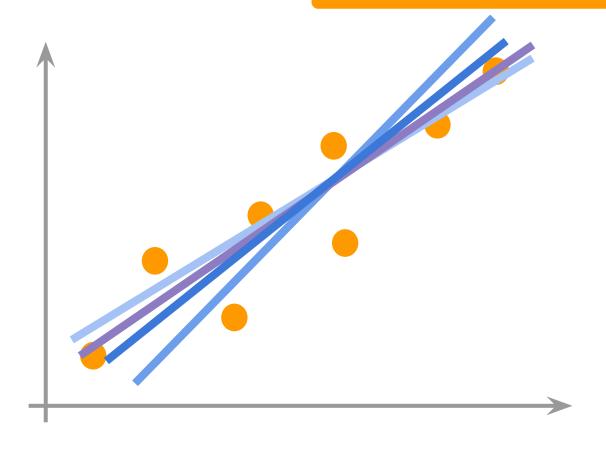
### Summarize cloud with a line



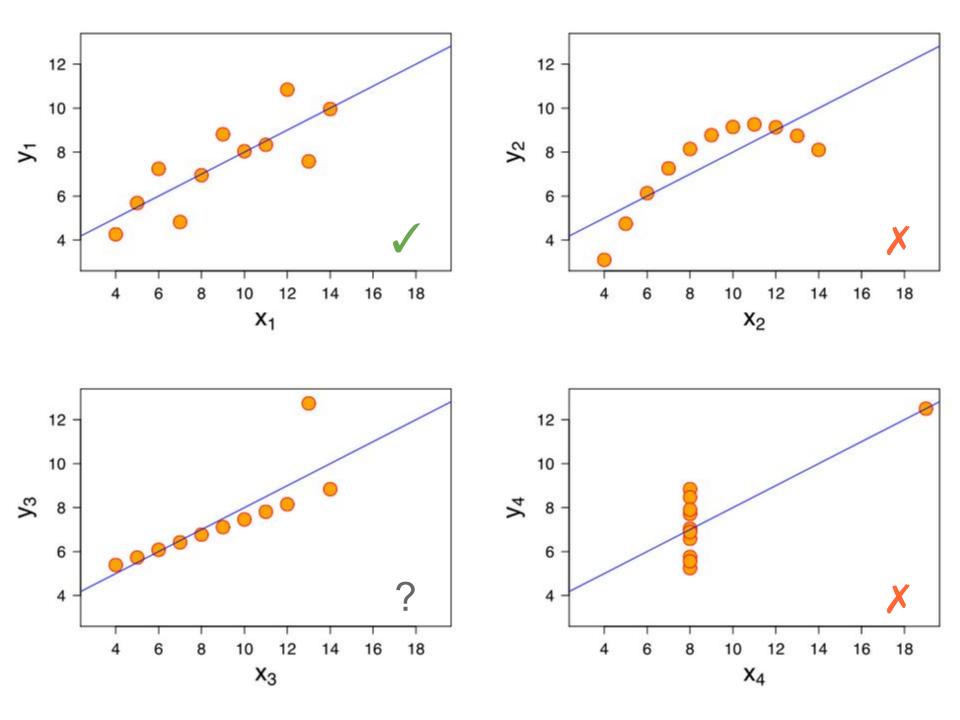
# How to find the "best" fitting line?

# Fitting a line

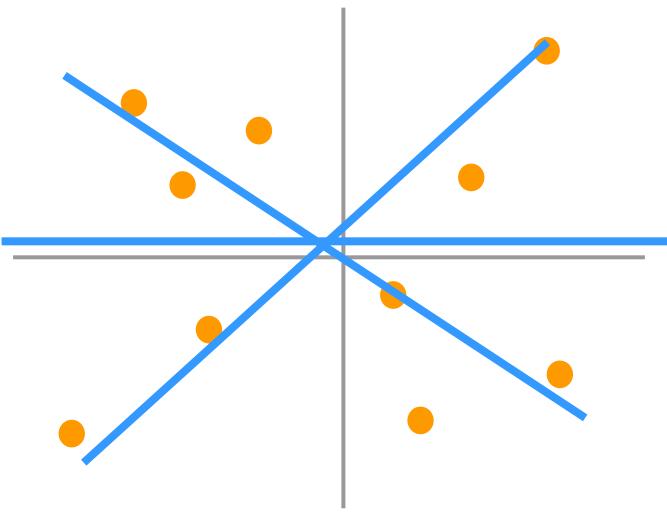
# which is the best line?



# Warning on the use of a regression line



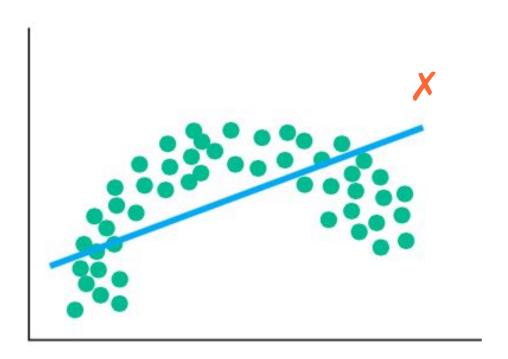
# Which line?



# Warning

The idea behind a regression line is based on the assumption that the data points are scattered about a line.

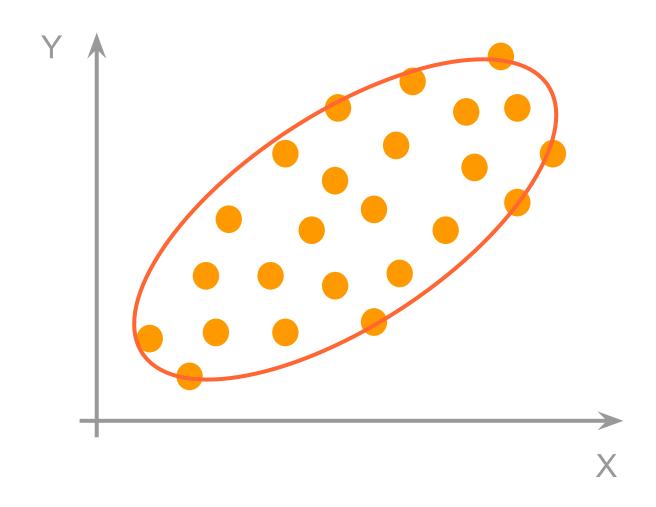
# Warning



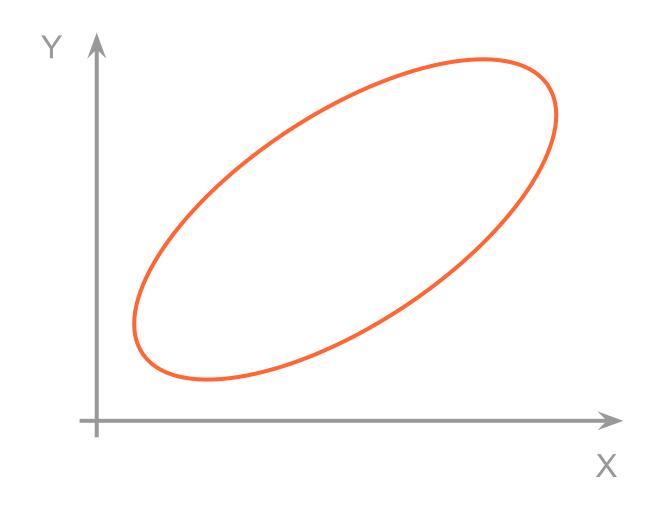
# Demo: Heights of parents and children

# Cloud of Points

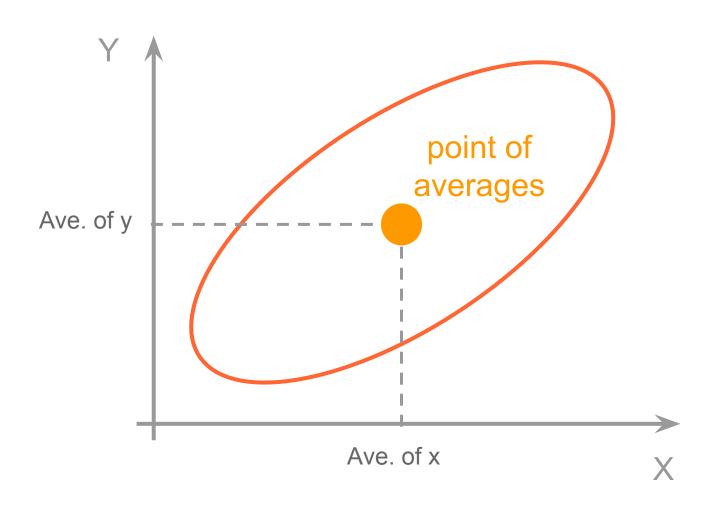
# Cloud of points



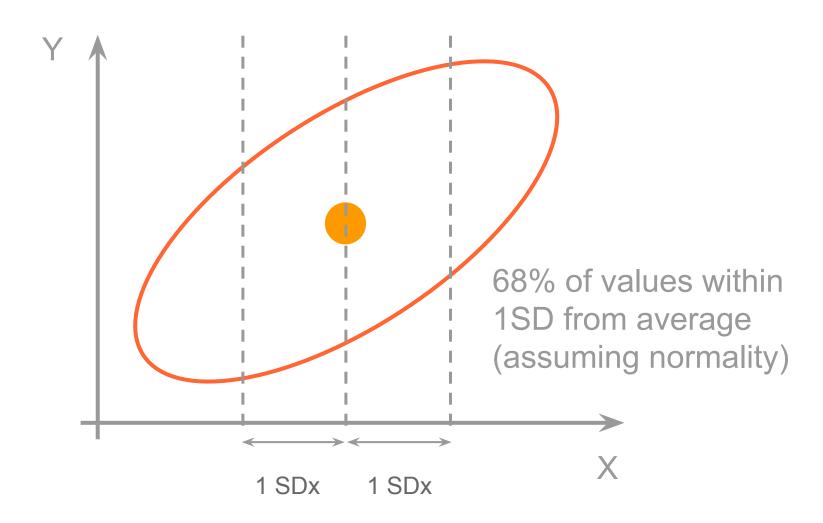
# Overall shape



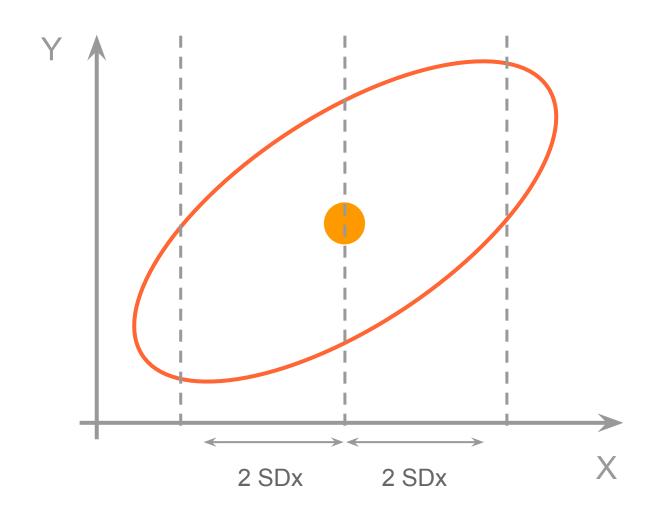
# The point of averages



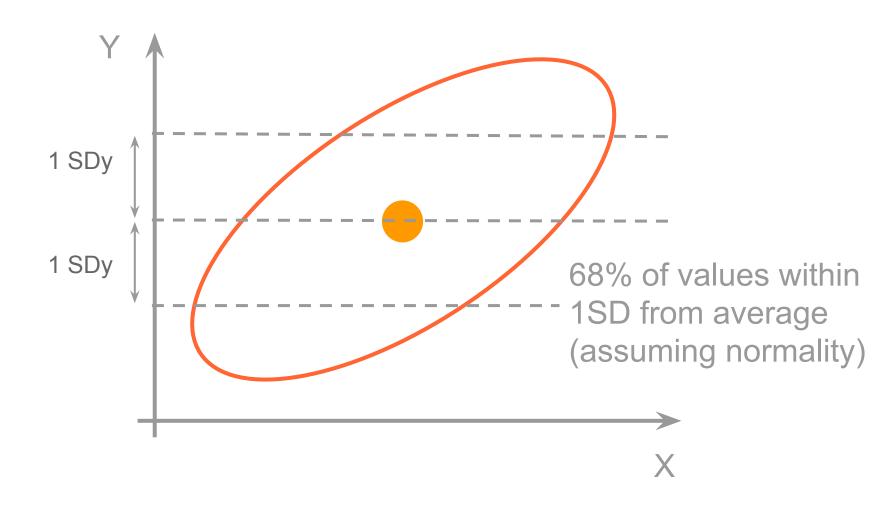
#### The horizontal SD



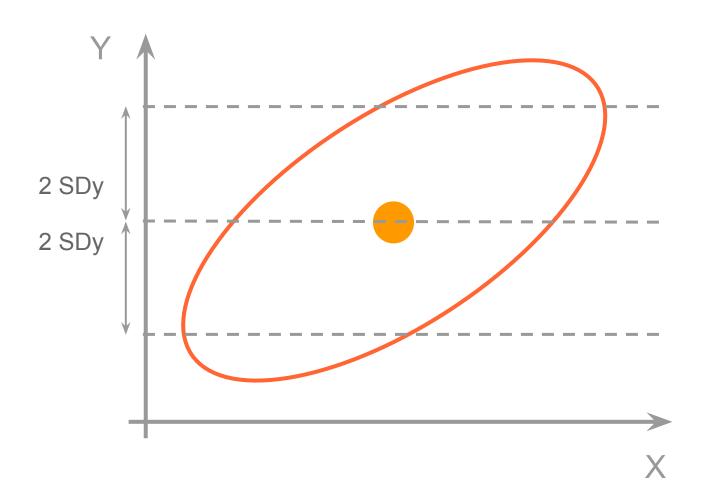
### The horizontal SD



#### The vertical SD



# The vertical SD



#### About the SD line:

Passes through the point of averages

If **r** > 0, the SD line goes up by 1 SDy when X goes 1 SDx to the right

Systematically off from the graph of averages

SD line is NOT the Regression line

Not really a good summary of the data

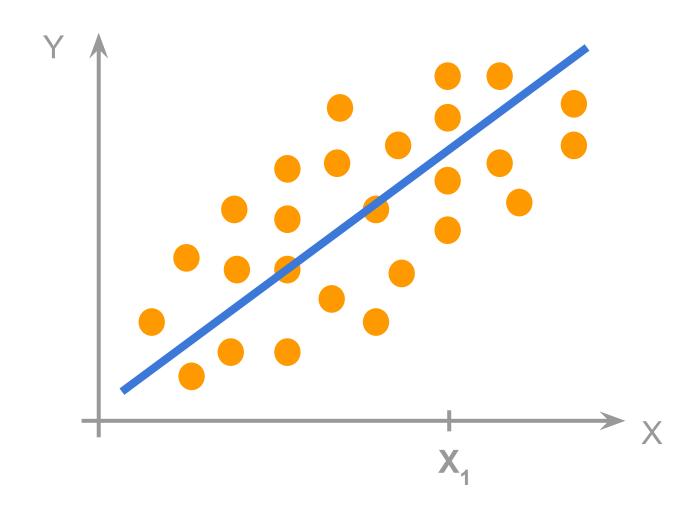
#### **Desirable Condition**

A "good" summary line would pass very close to the graph of averages

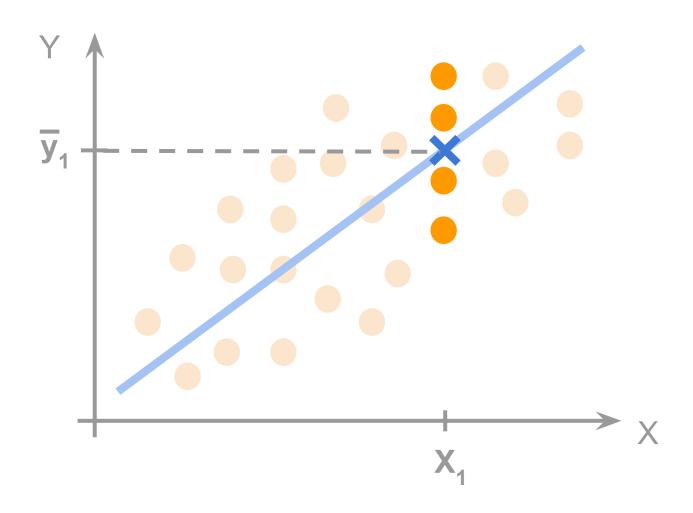
# Regression Method

The regression line for y on x estimates the average value for y corresponding to each value of x

# X estimates average of Y

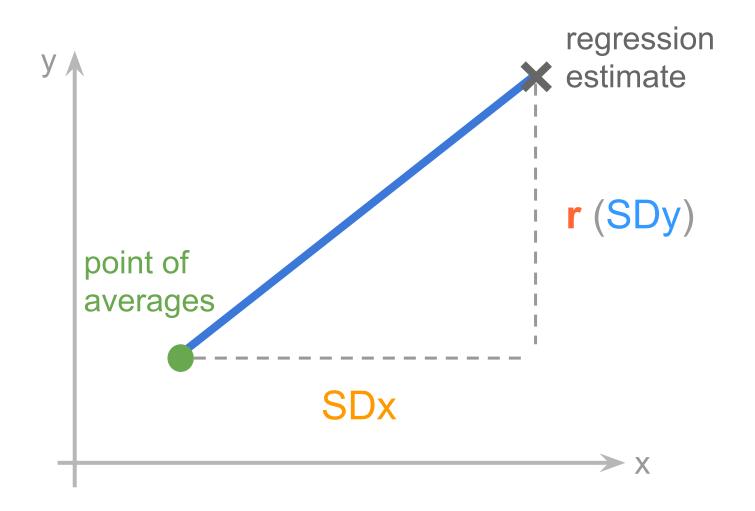


# X estimates average of Y



Associated with each increase of one SD in x there is an increase of only r SDs in y, on the average

## Regression Method



### Regression Method for Individuals

## Group of men with:

- average height = 70 inches, SD of 3 inches
- average weight = **180** pounds, SD of **45** pounds
- r = 0.40

Using the regression method to predict the weight of a man

### Regression Method for Individuals

# Group of men with:

- X: average height = 70 in, SD of 3 in
- Y: average weight = 180 lbs, SD of 45 lbs
- r = 0.40



Weight of man (unknown height)

best guess: 180 pounds

# Predicting weight from height

# Group of men with:

- X: average height = 70 in, SD of 3 in
- Y: average weight = 180 lbs, SD of 45 lbs
- -r = 0.40



Weight of man with height = 73 in

73 in is 1 SDx above avg 70 in

# Predicting weight from height

73 inches is 3 inches above the average (70) *i.e.* 1 SDx above the average

weight = 
$$(180) + (0.4)(45) = 198$$
 $\uparrow$ 
 $r$ 
 $SDy$ 

# The Regression Effect

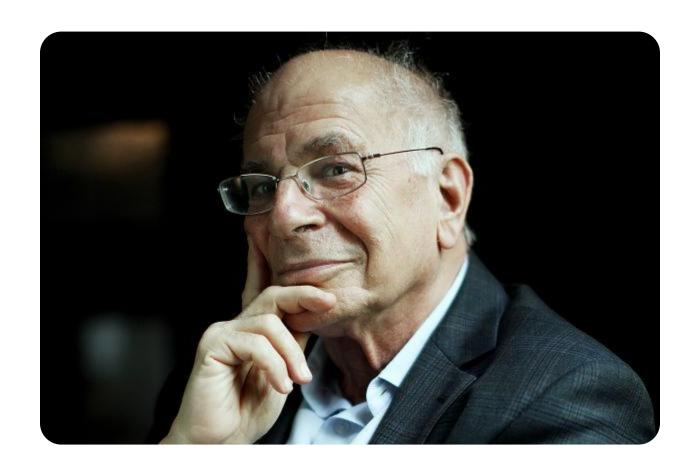
# Regression effect: Events tend to regress towards average over time

## The Regression Effect

In virtually all *test-retest* situations, the bottom group on the first test will on average show some improvement on the second test, and the top group will on average fall back.

# Demo: NBA Point Guards

## **Daniel Kahneman**



### Kahneman's example

Israeli-American psychologist

2002 Nobel Prize in Economic Sciences

Example: Psychology department of the Israeli Air Force

Flight instructors praise -vs- blame

#### Instructor's comment:

"On many occasions I have praised flight cadets for clean execution of some aerobatic maneuver, and in general when they try it again, they do worse. On the other hand, I have often screamed at cadets for bad execution, and in general they do better the next time. So please don't tell us that reinforcement works and punishment does not, because the opposite is the case."