# DATA SCIENCE WITH R



### REGRESSION

Regression Analysis 🖈







### **REGRESSION ANALYSIS**



Overview

Simple Linear Regression

Multiple Linear Regression

Regression Assumptions

Implementation in SAS



A regression is used to understand and quantify cause-effect relationships



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For example, what happens to sales of a brand of shampoo if there is a discount of 15% offered in a particular week?

We expect sales to go up

Here:

the cause: a reduction in price

the effect: an increase in sales



We know that the effect of a decrease in price is an increase in sales -

What if we also want to know, by how much? What is the increase in sales because of a 15% discount in price?

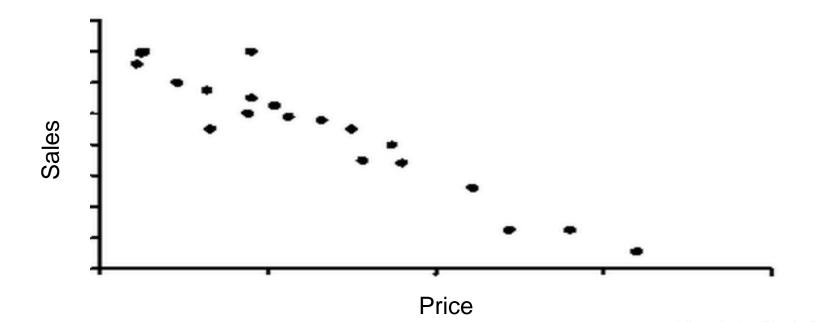
That is the quantification of the impact



Regression analysis is a statistical technique used to infer the magnitude and direction of a possible causal relationship between an observed pattern and variables assumed to have an impact on the observed pattern



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**Statistical** 

Magnitude

**Direction** 

Causal



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**Direction** – Positive or Negative

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Observed Pattern – Dependent variable, Distribution





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**Business Application** 



#### Example:

You work for a hospital and are looking to understand factors that may influence the birth weight of a baby



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What factors would you think of?

Maternal Diet



#### Example:

You work for a hospital and are looking to understand factors that may influence the birth weight of a baby

- Maternal Diet
- Gestation period



#### Example:

You work for a hospital and are looking to understand factors that may influence the birth weight of a baby

- Maternal Diet
- Gestation period
- Maternal health issues



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You work for a hospital and are looking to understand factors that may influence the birth weight of a baby

- Maternal Diet
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- > Ethnicity



#### Example:

You work for a hospital and are looking to understand factors that may influence the birth weight of a baby

- Maternal Diet
- Gestation period
- Maternal health issues
- > Ethnicity
- > Age of the mother



Is it possible to analyze the population?

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We can analyze a sample, and make inferences about the population based on the sample



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#### Sample:

1115 observations from a hospital in the US

|             |           | Mother's  |      | Smoked    |  |
|-------------|-----------|-----------|------|-----------|--|
| Birthweight | Weeks of  | education |      | during    |  |
| (grams)     | gestation | in years  | Race | pregnancy |  |
| 2898        | 40        | 0         | 0    | 1         |  |
| 994         | 26        | 0         | 1    | 1         |  |
| 3977        | 38        | 2         | 0    | 0         |  |
| 3040        | 37        | 2         | 0    | 1         |  |
| 3523        | 38        | 2         | 0    | 0         |  |
| 3100        | 40        | 5         | 0    | 1         |  |
| 3670        | 40        | 6         | 1    | 0         |  |
| 3097        | 41        | 7         | 1    | 0         |  |
| 3040        | 39        | 7         | 1    | 1         |  |
| 3239        | 39        | 7         | 1    | 1         |  |
| 2955        | 38        | 8         | 0    | 0         |  |
| 2200        | 38        | 8         | 0    | 0         |  |
| 3182        | 40        | 8         | 1    | 0         |  |
| 3510        | 40        | 8         | 0    | 0         |  |
| 3381        | 39        | 8         | 1    | 1         |  |
| 3530        | 40        | 8         | 1    | 0         |  |
| 2985        | 38        | 8         | 1    | 1         |  |
| 3374        | 39        | 8         | 1    | 0         |  |
| 3765        | 42        | 8         | 0    | 0         |  |
| 2715        | 39        | 8         | 1    | 0         |  |
| 3640        | 39        | 8         | 1    | 0         |  |
| 3040        | 42        | 8         | 1    | 0         |  |



Is it possible to analyze the population?

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#### Sample:

1115 observations from a hospital in the US

Are these the only factors that impact birth weight of a baby?

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| 3765        | 42        | 8         | 0    | 0         |
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- The possible causes of baby birth weight in this dataset are gestation weeks, mother's education, race, and smoking during pregnancy

What are possible ways of assessing these relationships?

- Graphical visualization
- Correlations
- Run regression model



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- Statistical Significance of the impact



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We will review the simplest type of regression, linear regression



### To Be Continued

### Regression Analysis

Simple Linear Regression



### **THANK YOU**