# Experiments and Observational Studies

## Goal: identify causal associations

- Does changing the value of the **explanatory variable(s)** cause the value of the **response variable** to change?
  - Explanatory variables: whether or not a child eats peanuts, whether or not a child takes medicines
  - Response variable: whether or not the child develops a peanut allergy

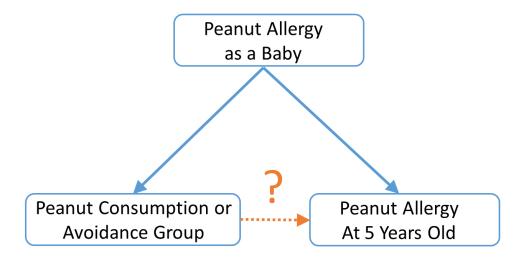
# 2 Types of Studies

- 1. **Experiments**: The explanatory variable(s) are controlled by the researcher (the researcher randomly assigns the value of the explanatory variable to each subject).
  - Researcher assigns babies to either consume or avoid peanuts, and to either take or not take medicine
- 2. **Observational** studies: the explanatory variable(s) are not manipulated or controlled by the researcher.
  - Babies either end up consuming peanut or avoiding peanuts, taking medicine or not, for reasons outside of the researcher's control.
- To demonstrate a **causal** relationship, need to run an **experiment**.

## Confounding

• A **confounder** is a variable that is associated with both the explanatory variable and the response variable, but is not in the 'causal pathway'.

Example: Suppose we let families choose whether their child is in the peanut consumption group or the peanut avoidance group...



#### **Factors and Treatments**

- Factor: an explanatory variable under the researcher's control (different from R's use of the term factor for any categorical variable!)
  - Factor 1: Peanut consumption (2 Levels: Yes, No)
  - Factor 2: Allergy Medication (2 Levels: No Medication, Medication)
- **Treatment**: A combination of levels of factors for a given subject
  - 4 treatments: (1) Peanut consumption, No medication (2) Peanut consumption, Medication (3) Peanut avoidance, No medication (4) Peanut avoidance, Medication

# Four Priciples of Experimental Design

### Goal: Prevent/Limit Confounding

- Control: Control sources of variation other than the factors we are testing by making conditions as similar as possible for all treatment groups.
  - Make sure that are no other major differences in diet between the groups, other than peanut consumption
- Randomization: Subjects/experimental units are assigned to treatments at random to equalize the effects of unknown or uncontrollable sources of variation.
- Replication:
  - Within Experiment: Each treatment is applied to more than one subject/experimental unit.
  - Across Experiments: Re-do the entire experiment under different settings
- **Blocking**: Group together subjects/experimental units that are similar in important ways that you cannot control, then randomize the assignment of treatments within each of these groups, or blocks.
  - Block according to intial allergy test results.

## What to do in Observational Studies??

We can't do control or randomization or blocking!!

- Matching: Find study participants who:
  - have different levels of the explanatory variables of interest, but
  - are similar in ways that are not directly being studied
  - compare values of the response variable between these matched participants.
- Closest we can get to blocking and randomization in an observational study.