#### Introduction

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A short course on concepts and methods in Causal Inference



#### Statistical association

- Any attempt to discover a causal effect often starts by observing a statistical association
- A 'statistical association' between two factors means that they 'tend to appear together'
  - lung cancer is more common among smokers than among non-smokers
  - sickness is more common in hospitals than outside hospitals

## Definition of epidemiology

Epidemiology is the science that studies the patterns, causes, and effects of health and disease conditions in defined populations.

Wikipedia, 2015



#### Association vs causation

- However, association does not imply a causation
- Apart from a true causal effect, what could possibly explain the association between
  - smoking and lung cancer?
  - hospitals and sickness?

## The Bradford Hill criteria for causation (1965)

- Strength of association
- Consistency
- Specificity
- Temporality
- Dose-response relationship
- Plausibility
- Coherence
- Experimental evidence
- Analogy





### Definition of causal effect

- The Bradford Hill criteria is a checklist of important considerations to make, when trying to infer causality
- The criteria do not **define** a causal effect
  - a causal effect may satisfy all or none of the criteria (apart from temporality, which is absolute)
- So what is the definition of a 'causal effect'?



# Brief history of causal inference, 70's

- Donald Rubin developed a formal definition of causal effects
  - potential outcomes
  - counterfactuals



# Brief history of causal inference, 80's

- James Robins discovered and solved - some important problems with longitudinal studies, from a causal inference perspective
  - Marginal Structural Models (MSMs)
  - Structural Nested Models (SNMs)



# Brief history of causal inference, 90's

- Judea Pearl developed
  Directed Acyclic Graphs
  (DAGs)
  - simplify interpretation and communication in causal inference
  - useful for covariate selection in observational studies





## Before we start...

- Causal inference has been an intense research field over the last 20 years
  - countless papers and several books
- This is a brief introduction course
  - we will only have time to scratch the surface



## Outline

- Association vs causation
- Estimation of causal effects
- Directed Acyclic Graphs (DAGs)
- Multiple exposures
- Regression models

