Causal Graphs*

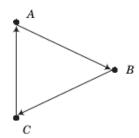
Definitions, patterns, and strategies

Definitions

- A **node** represents a random variable labeled by letter. Observed random variables are marked by solid circle and unobserved by hollow circle •.
- An edge shows dependence between joining variables.
- Adjacent variables are connected by an edge.
- Adjacent edges meet at a variable.
- A directed edge represents the cause by a single-headed arrow.
- A parent/child is the starting(tail)/ending(head) variable. Therefore, a directed edge represents a direct effect of a parent on a child.
- A **root** is a variable that has no parent. In other words, it is an exogenous variable determined only by forces outside of the graph.
- A **sink** is a variable with no children.
- A path is a sequence of adjacent edges.
- A directed path is a path traced out entirely along arrows tail-to-head. If there is a directed path from A to B, A is an ancestor of B; B is a descendant of A.
- A directed acyclic graph (DAG) is a graph with only arrows for edges and no feedback loops (i.e. no variable is its own ancestor or its own descendant):

^{*}We are indebted to Liudmila Kiseleva for the design of the handout.

Figure 1: Directed acyclical graph



• Mutual dependence of two variables on one or more common causes is shown by a curved and dashed bidirected edge:

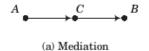
Figure 2: Mutual dependence

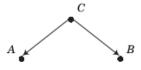


Patterns

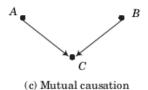
- Chain of mediation is a relationship when A affects B through A's causal effect on C and C's causal effect on B.
- Mutual dependence is a relationship when A and B are both caused by C.
- Mutual causation is a relationship when A and B arer both causes of C.
- A **confounding variable** is a variable that affects both the dependent and independent variable (in our example, variable C on the figure 3.b).
- A **collider** is a variable that has two arrows running into it (in our example, variable C on the figure 3.c).
- A back-door path is a path between any causally ordered sequence of two variables that include a directed edge that points to the first variable.
- Conditioning as a modeling strategy means transforming one graph into a simpler set of component graphs where fewer causes are represented.

Figure 3: Main patterns





(b) Mutual dependence



Strategies

A back-door criterion is a set of conditions used to determine whether or not conditioning on a given set of observed variable will identify the causal effect. The causal effect is identified by conditioning on a set of variables Z if and only if all back-door paths between the causal variable and the outcome variable are blocked after conditioning on Z. All back-door paths are blocked by Z if and only if each back-door path:

- contains a chain of mediation $A \to C \to B$ where the middle variable C is in Z, or
- contains a fork of mutual dependence $A \leftarrow C \rightarrow B$, where the middle variable C is in Z, or
- contains an inverted fork of mutual causation A → C ← B, where the middle variable
 C and all of C's decendents are not in Z.

References

Morgan, S., & Winship, C. (2014). Counterfactuals and causal inference. Cambridge, England: Cambridge University Press.

Pearl, J. (2009). Causality. Cambridge, England: Cambridge University Press.