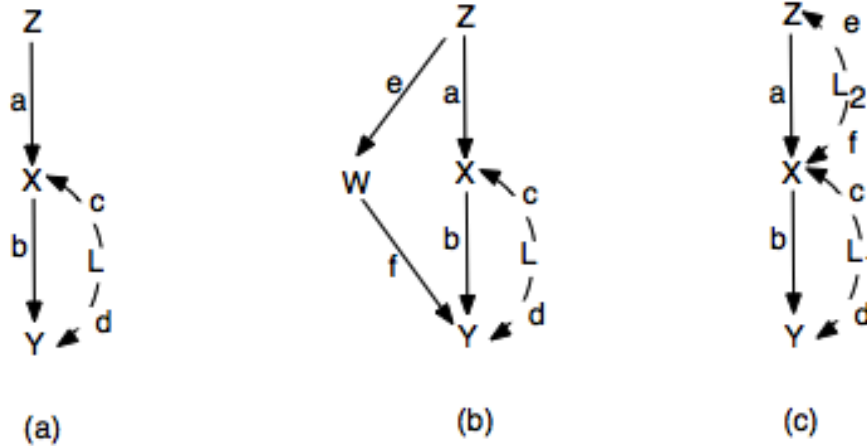


## Ralph's instrumental variables

Ralph is considering the following causal graphs (DAGs — directed acyclic graphs) in which only  $W, X, Y, Z$  are observable and the objective is identification of the causal effect of  $X$  on  $Y$ ,  $X \rightarrow Y$ .



Ralph knows a graphical definition of an instrument is as follows. A variable  $Z$  is an instrument with respect to the causal effect  $X \rightarrow Y$  if  $Z$  is related to  $X$  but independent of  $Y$  in the graph with the direct path from  $X$  to  $Y$  deleted. The IV strategy is regress  $X$  and  $Y$  on  $Z$  (and possibly some set of covariates  $S$ ) to produce estimands  $r_{xz \cdot s}$  and  $r_{yz \cdot s}$ , then the causal effect  $X \rightarrow Y$  can be retrieved from the ratio of estimands  $\frac{r_{yz \cdot s}}{r_{xz \cdot s}}$  times whatever value  $X = x$  is set.

$$\begin{aligned} E[Y \mid do(X = x)] &= \frac{r_{yz \cdot s}}{r_{xz \cdot s}} x \\ &= bx \end{aligned}$$

Suggested:

1. Can  $X \rightarrow Y$  be identified by a back-door adjustment in any of the three settings? Explain.

2. Is conditioning on  $W$  in (b) helpful for satisfying the instrumental variable criteria? Explain.

3. For each case, demonstrate how instruments  $Z$  can be employed to identify the causal effect of interest,  $X \rightarrow Y$ . That is, derive the estimand for each step in the linear-IV strategy and explain how confounding due to the omitted, correlated (unobserved) variables is addressed.