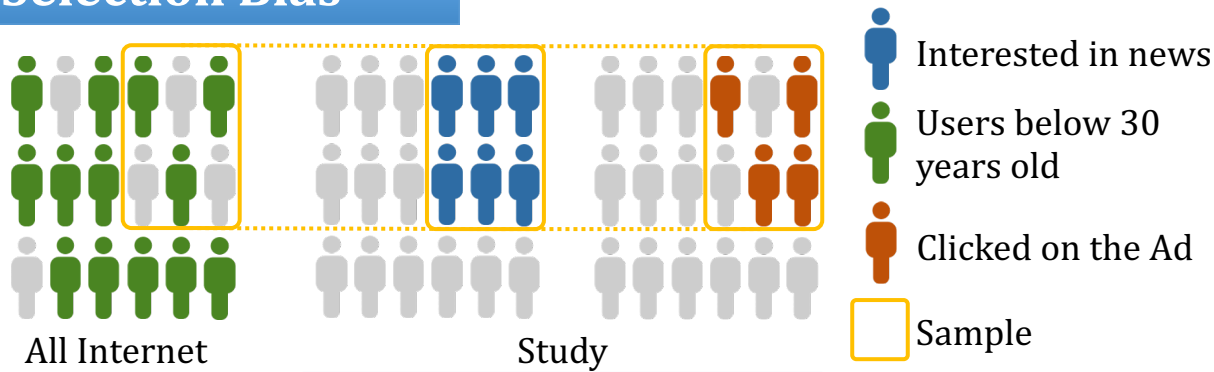


# Causal Effect Identification by Adjustment under Confounding and Selection Biases

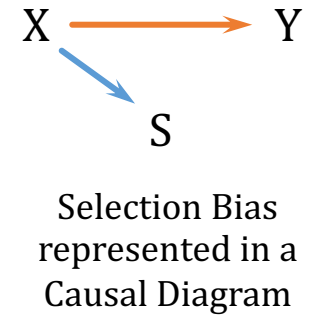
## Causal Inference

Answer questions about change, i.e. *How will the click through rate (Y) change, if an agent picks the topic (X) of the ad displayed to the users?*

## Selection Bias



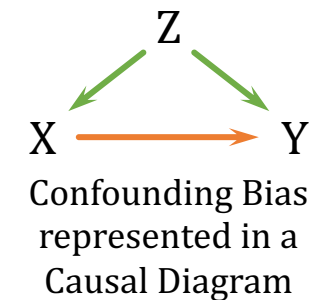
Proportions in the sample do not match those in the whole population!  
Will our conclusions hold for the general advertisement business?



## Confounding Bias

- Age (Z) of the user influences what topics are likely to be shown.
- Age (Z) affects the likelihood of the user clicking the ads.

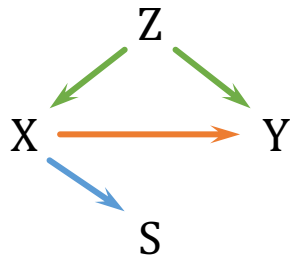
How much is the topic (X) affecting the click through rate (Y)?



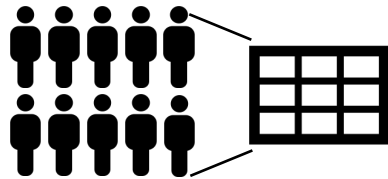
# Causal Effect Identification by Adjustment under Confounding and Selection Biases

## Our Task

- Consider both Selection Bias and Confounding bias simultaneously



- Use external data without selection bias to enhance the robustness of the inference process



## Applications

 Robotics

 Statistics

 Economy

 Medicine

 Biology

 Experimental Design

 Epidemiology

 Marketing

## Contributions

- Complete criterion to decide valid covariate adjustment sets without external data.
- Complete criterion when measures on the covariates are available from external data.
- Efficient (polynomial delay) algorithm to find such sets systematically.