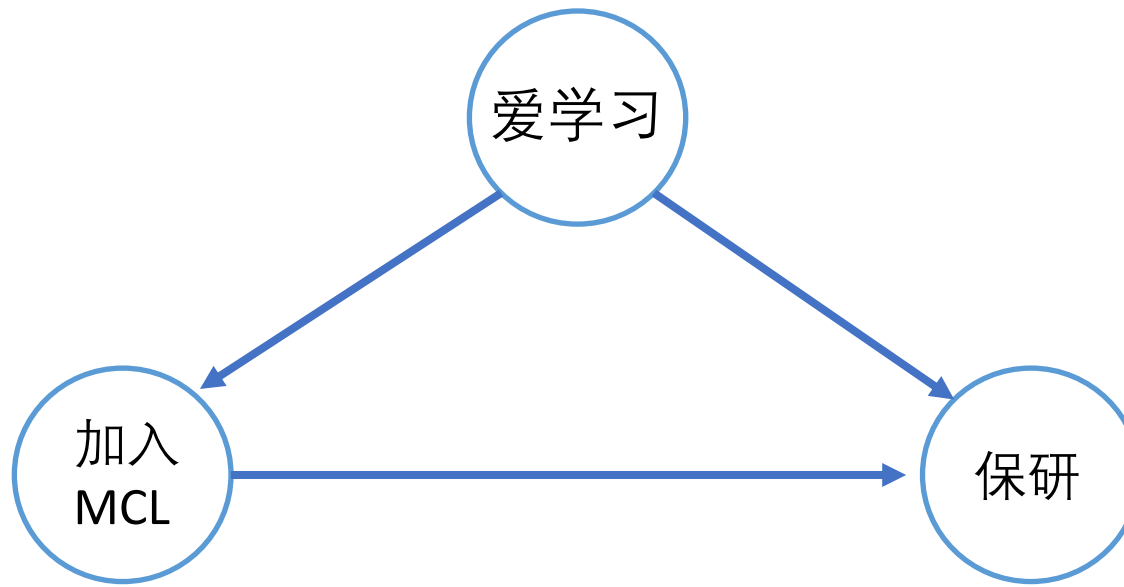


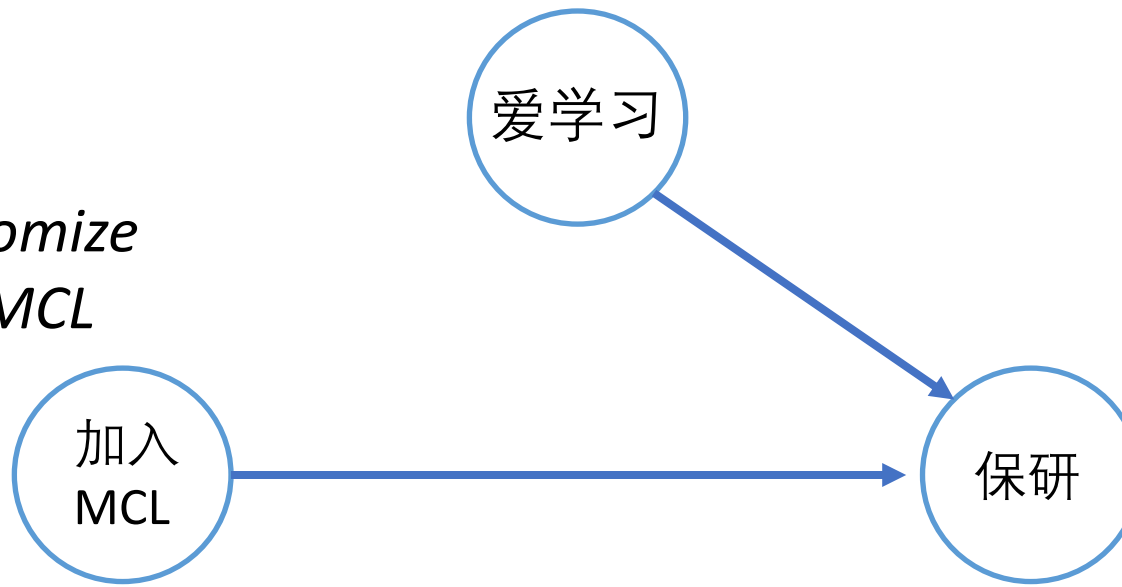
# 5. Randomized Experiment



Target of randomized experiment:

*Keeping the same distribution of all confounders  
the same irrespective of different treatment.  
(Covariate Balance)*

*Randomize*  
加入MCL

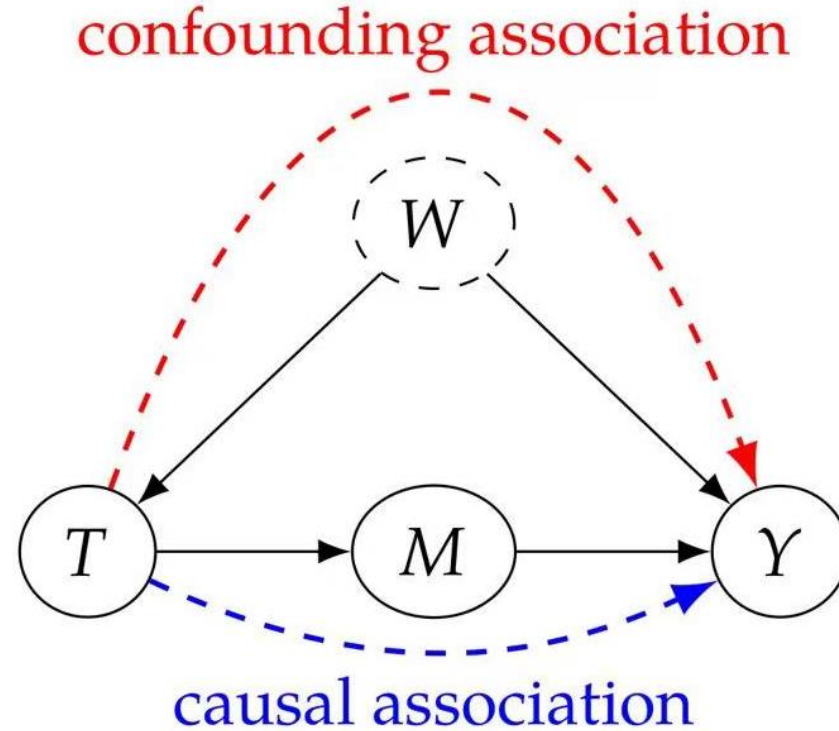


$$P(\text{保研} | do(\text{加入MCL})) = P(\text{保研} | \text{加入MCL})$$

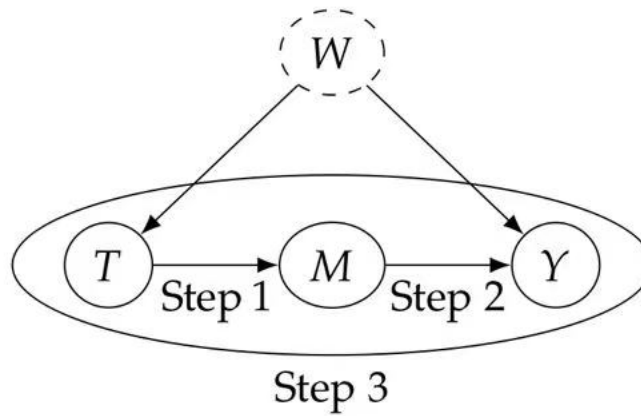
Condition can be used instead of **do()** operation  
given **covariate balance**.

## 6. Frontdoor Adjustment

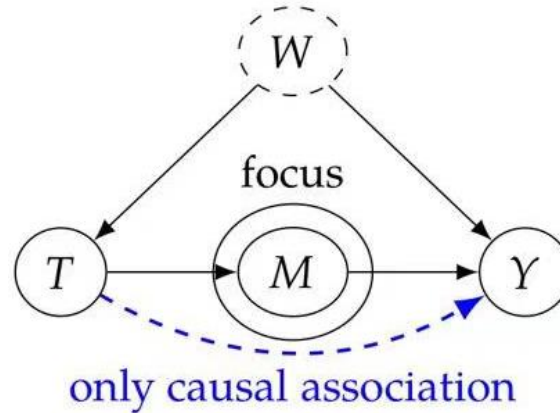
# Why using frontdoor adjustment?



*Unobserved confounders make it not available to use backdoor adjustment*



What if we combine the causal effect from  $T$  to  $M$  and from  $M$  to  $Y$  since both of them are **purely causal**.

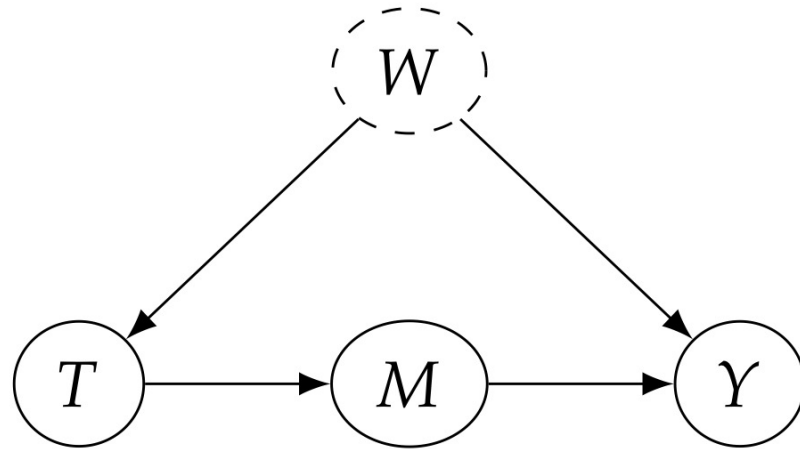


This method is called frontdoor adjustment.

# Frontdoor adjustment:

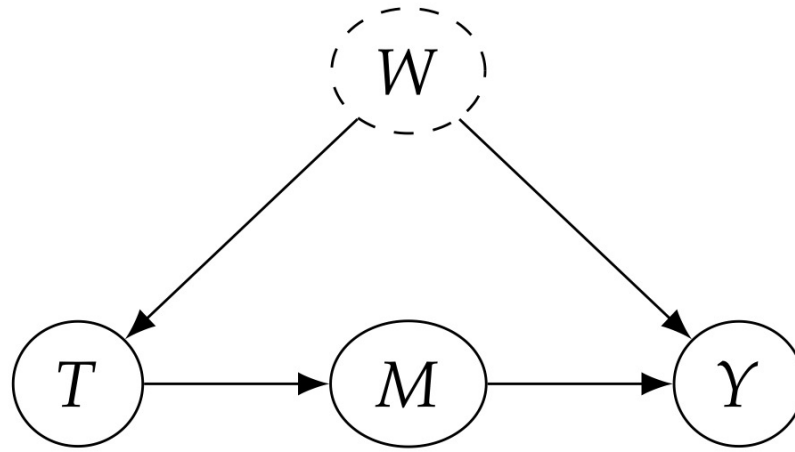
**Theorem 6.1** (Frontdoor Adjustment) *If  $(T, M, Y)$  satisfy the frontdoor criterion and we have positivity, then*

$$P(y \mid \text{do}(t)) = \sum_m P(m \mid t) \sum_{t'} P(y \mid m, t') P(t') \quad (6.4)$$

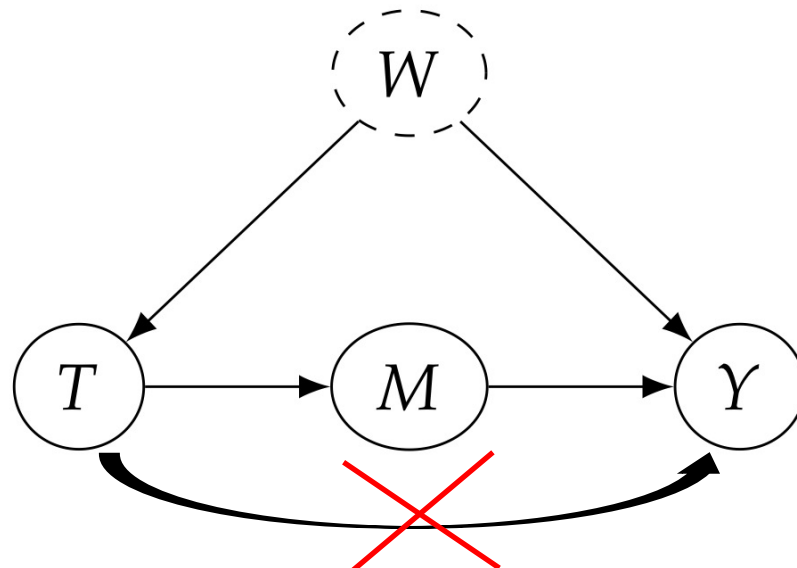


Using **M** to do frontdoor adjustment from **do(T=t)** to **Y**

## Limitation:

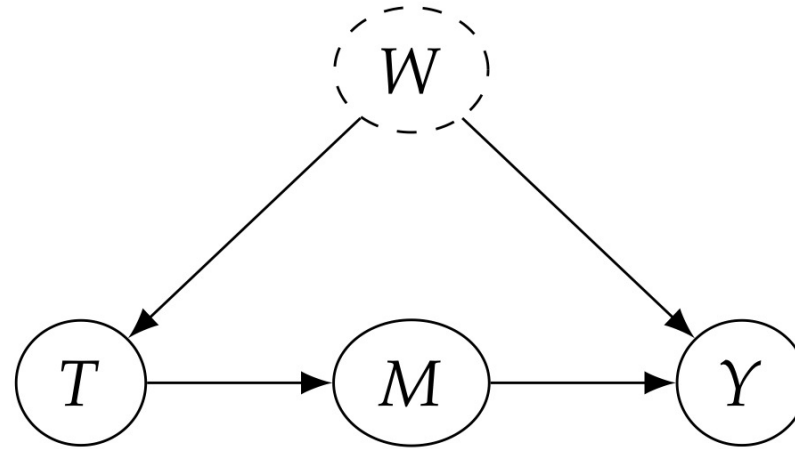


1. All the causal path from  $T$  to  $Y$  must go via  $M$ .  
( $M$  must be the totally frontdoor between  $T$  and  $Y$ ).

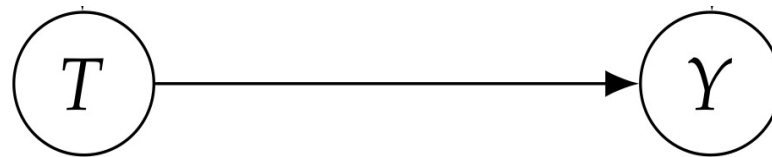




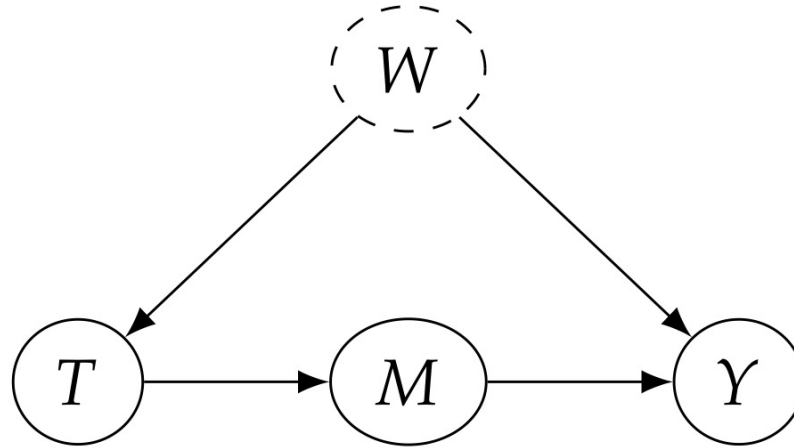
2. The relation flow from  $T$  to  $M$  must be purely causal.



$P(m | t) = P(m | \text{do}(t))$  needed to use frontdoor adjustment.



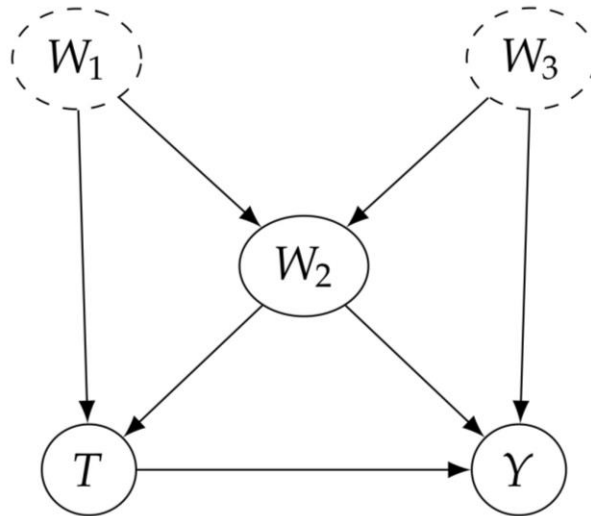
3.  $T$  is available for backdoor adjustment from  $M$  to  $Y$ .



Proof of frontdoor adjustment.

Now that we know frontdoor adjustment and backdoor adjustment can **change causal estimator to statistics estimator**

But, how can we be sure that a variable is *identifiable*?



Is  $P(y \mid \text{do}(t))$  identifiable?

**Theorem 6.3** (Unconfounded Children Identifiability) *Let  $Y$  be the set of outcome variables and  $T$  be a single variable. If the unconfounded children criterion and positivity are satisfied, then  $P(Y = y \mid \text{do}(T = t))$  is identifiable*

**Definition 6.2** (Unconfounded Children Criterion) *This criterion is satisfied if it is possible to block all backdoor paths from the treatment variable  $T$  to all of its children that are ancestors of  $Y$  with a single conditioning set.*

