Condition on common cause or its **proxy**: A and Y share both measured and unmeasured common causes; we condition to block the open backdoor path. Do not condition on a mediator: inaccurate timing: L blocks true causal association  $\overline{A} \to Y$ . Do not condition on a collider: inaccurate timing: |L| creates path  $Y_2$ from A - - Y. Proxy rule: conditioning on a descendent is akin to condition on its parent: inaccurate timing: confounder proxy L' creates a path

**Problem** 

Sequential data solution

## Kev:

A denotes the treatment:

from A - - Y.

**Bias** 

Y denotes the outcome:

U denotes an unmeasured confounder:

L denotes a confounder:

--- asserts causality

indicates a pathway for bias linking A to Y absent causation.

X indicates that conditioning on X introduces bias.

Where  $\phi t$  denotes assumed confounding, examples 2-4 illustrate how errors in  $L_{\phi t} \neq L_t$  lead to confounding.