

## Lab 5

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OBJECT OF TYPE CLOSURE



YS NOTTE SVBSETTABLE



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## IV intuition

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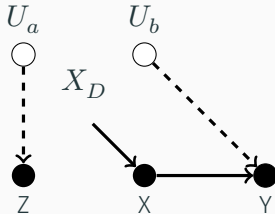
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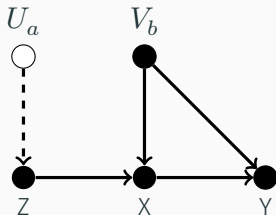
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## DAG setup

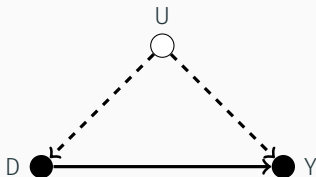


What's going on here? Is the relationship between  $X$  and  $Y$  identified?

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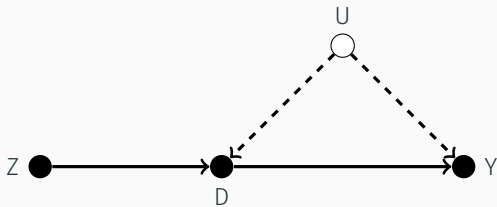
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Classic confounder problem...what can we do?



## DAG setup



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To defend it, often refer to theory - and some people will never buy your argument



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More modern (and possibly more convincing) method: placebo tests (also called falsification tests)

### 3 causal effects

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