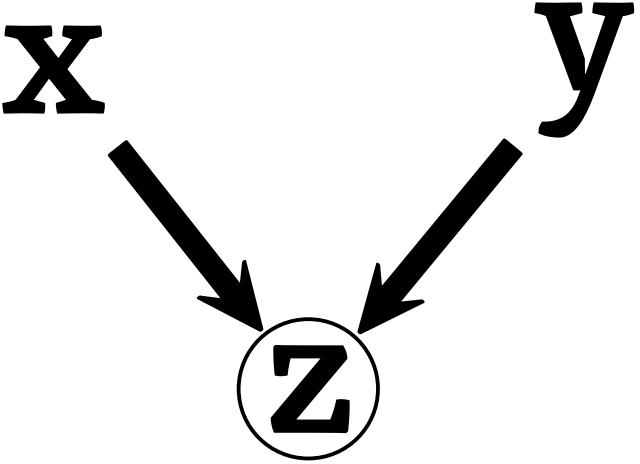




NO EFFECT OF X ON Y, BUT BOTH AFFECT Z



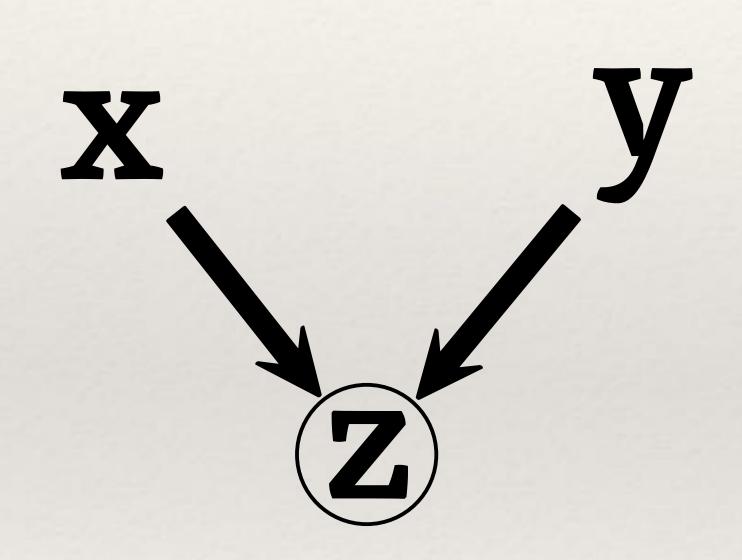
Math

$$y \sim Normal(\alpha_y, \sigma_y)$$

$$x \sim Normal(\alpha_x, \sigma_x)$$

$$z \sim Normal(\alpha_z + \beta_{zx}x + \beta_{zy}y, \sigma_z)$$

NO EFFECT OF X ON Y, BUT BOTH AFFECT Z



Math

 $y \sim Normal(\alpha_y, \sigma_y)$

 $x \sim Normal(\alpha_x, \sigma_x)$

 $z \sim Normal(\alpha_z + \beta_{zx}x + \beta_{zy}y, \sigma_z)$

NO EFFECT OF X ON Y, BUT BOTH AFFECT Z

```
set.seed(1)
N = 100
x = rnorm(N)
               \# x \sim normal(0, 1)
            \# y \sim normal(0, 1)
y = rnorm(N)
z = rnorm(N, 1 + x + y) # z ~ normal(1 + x + y, 1) -> collider
m1 = ulam(alist(
    y \sim normal(a + bx*x, sigma),
    a \sim normal(0, 0.3),
    bx \sim normal(0, 0.3),
    sigma ~ exponential(1)),
    data = list(y = y, x = x),
    iter = 1000, chains = 4, cores = 4)
```