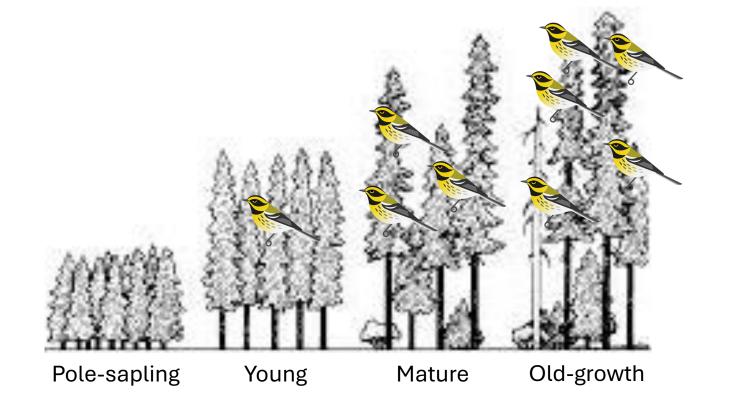
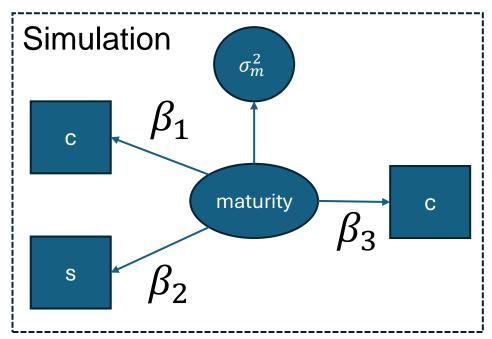
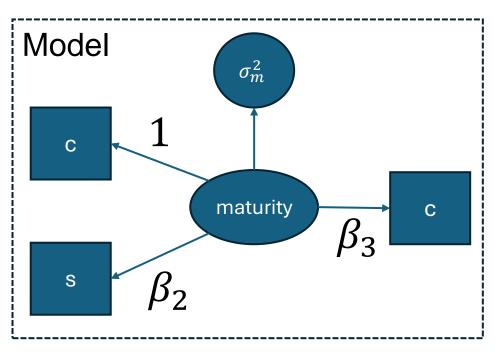
# Latent variables: part II







# What is a latent (or hidden) variable?



A random variable that is unmeasured but not necessarily unmeasureable.

-P Spirtes (2001)

A variable that is not directly observable but is inferred from other variables that can be measured

-Generative AI (yesterday)

Variables that can only be inferred indirectly through a mathematical model from other observable variables

-Wikipedia (also yesterday)

# What is a latent (or hidden) variable?

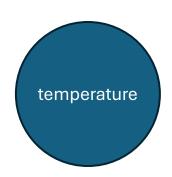


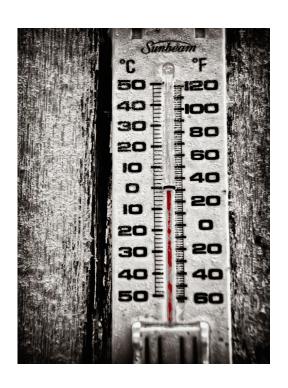
## Everything is a latent variable – LA Dyer



## Is temperature a latent variable?





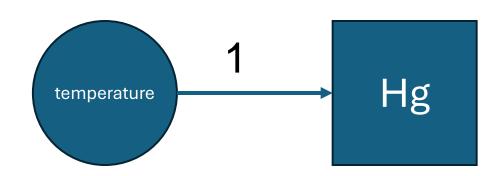


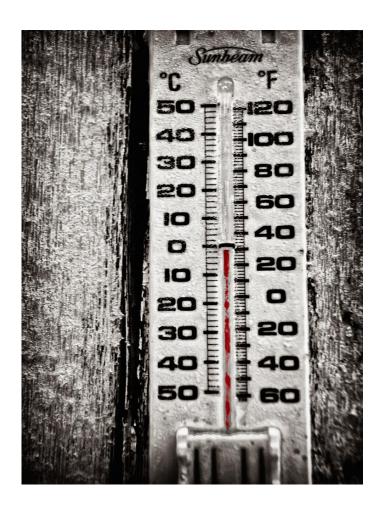
A random variable that is unmeasured but not necessarily unmeasureable.
-P Spirtes (2001)

Temperature is the average kinetic energy of particles

## Temperature is a latent variable



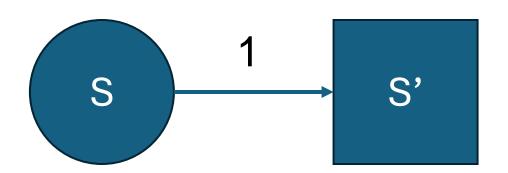




Temperature is the average kinetic energy of particles

## **Survival**



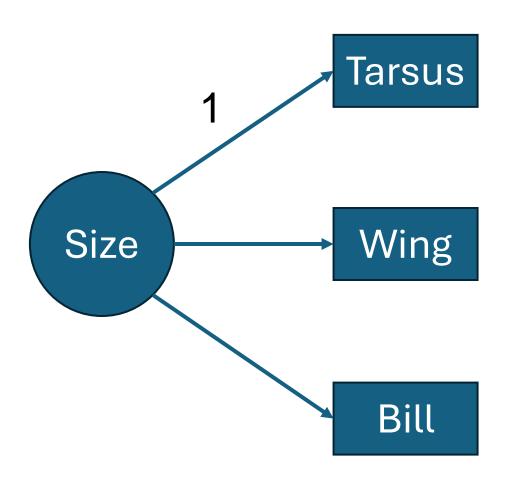




S: survival of a population, S': survival of a marked sample

## Size



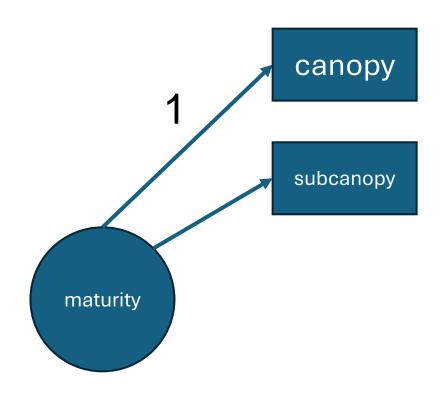


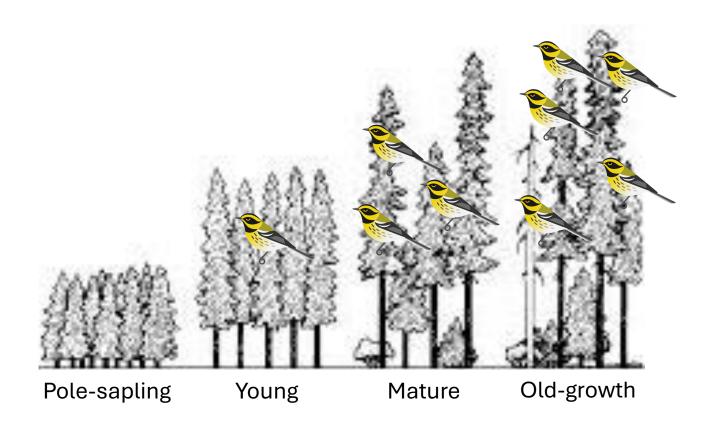


'Size' is a human construct

# **Forest maturity**



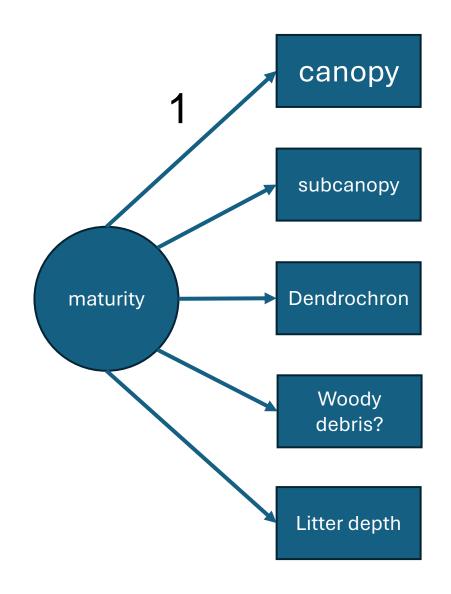


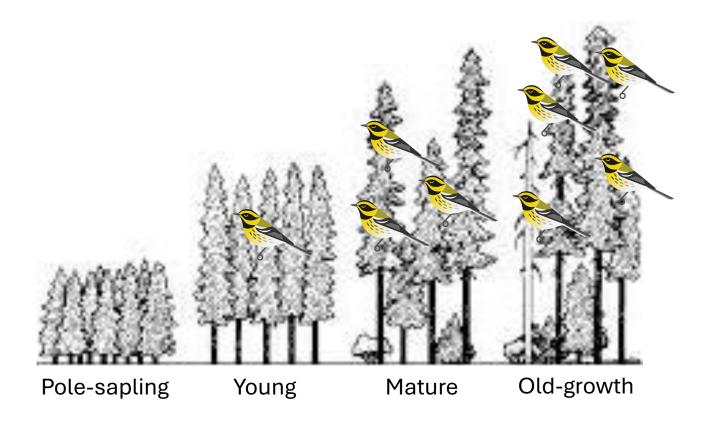


# These 'seral stages' are human constructs

# **Forest maturity [expanded]**

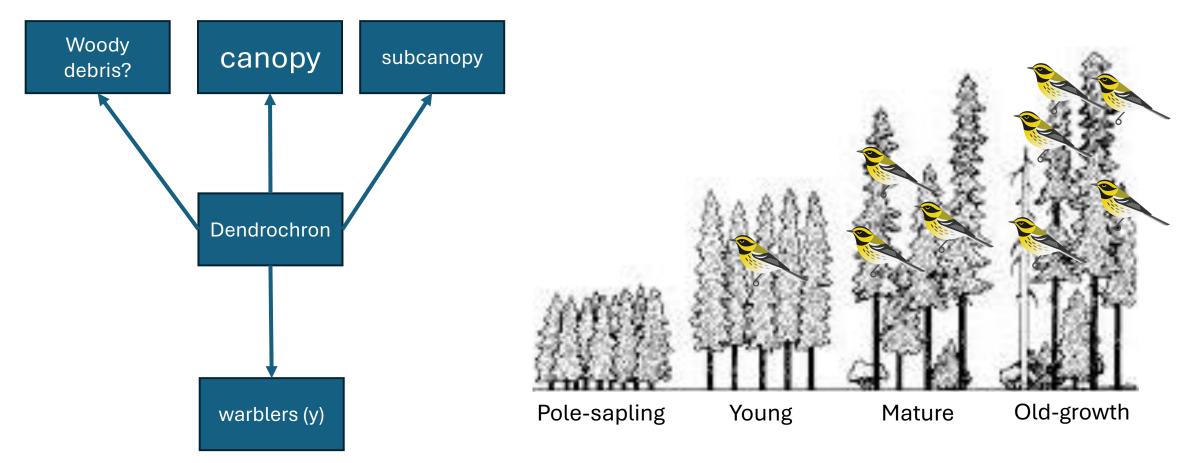






# We could structure this differently

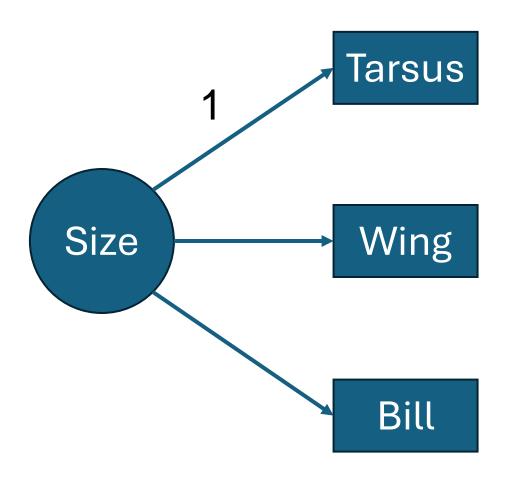




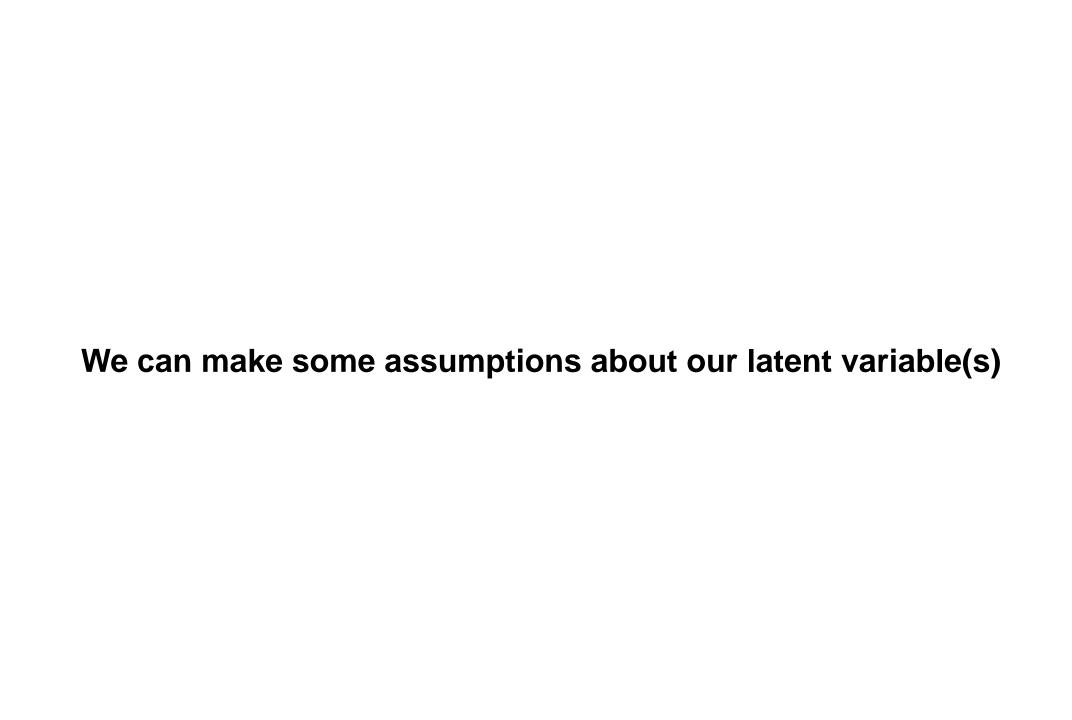
We don't have to use latent variables!

# They're just very useful...









We generally assume they're normally distributed

$$\boldsymbol{m} \sim \operatorname{normal}(\mu, \sigma_m^2)$$

#### We assume that they are zero-centered b/c they're human constructs

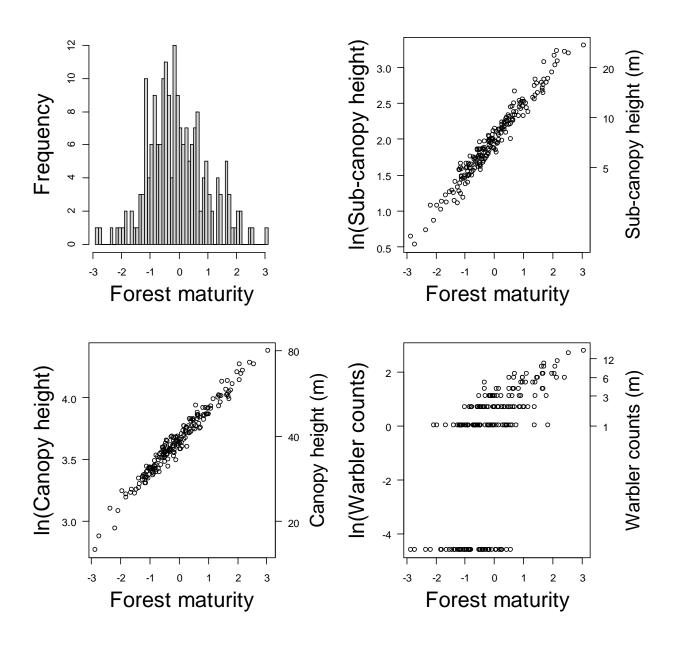
i.e., what should the scale of forest maturity be?

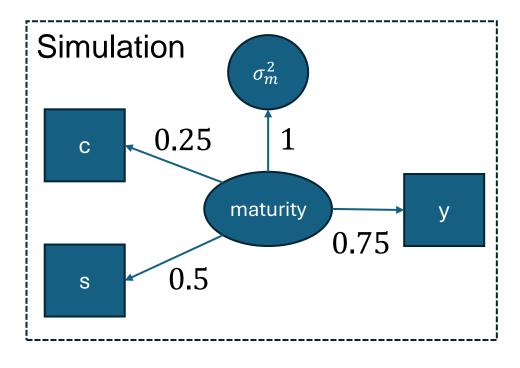
$$\boldsymbol{m} \sim \text{normal}(0, \sigma_m^2)$$

Assigning an intercept would be entirely subjective, plus the math is easier if  $\mu = 0$ 

So let's talk about this 'fixing a loading to 1' thing

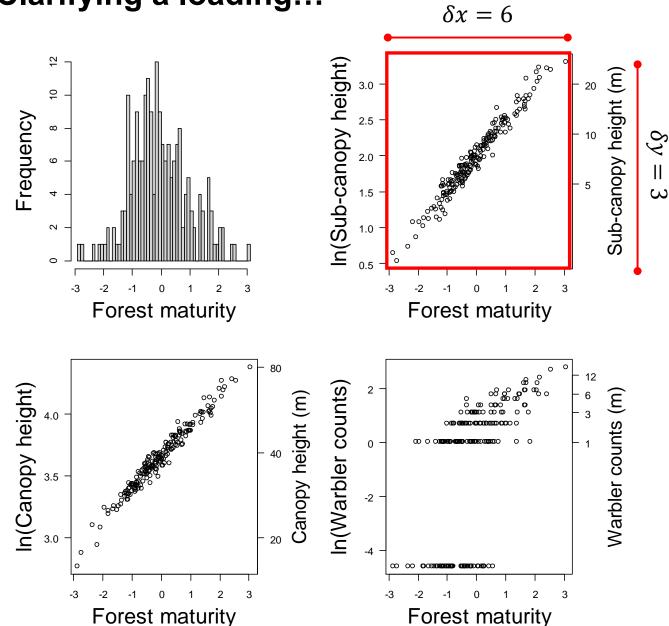
#### Let's simulate some data

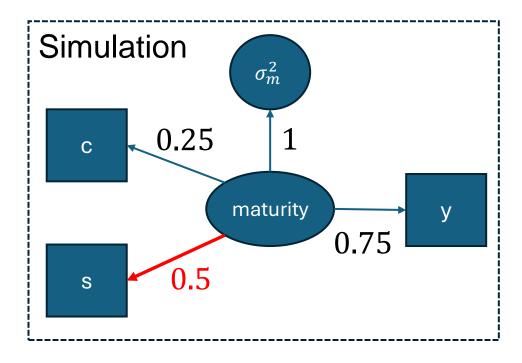




$$\delta y = \delta x \beta$$

### Clarifying a loading...

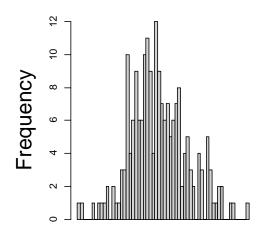




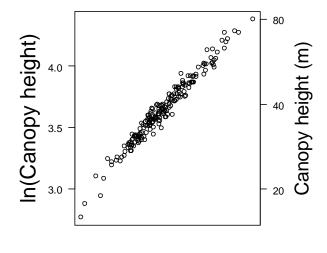
$$\delta y = \delta x \beta$$
$$3 = 6\beta$$

Now, let's build a model

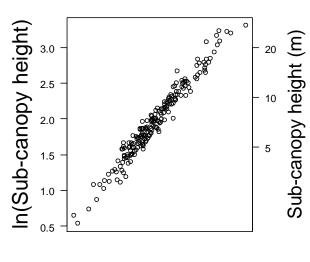
#### Shoot...



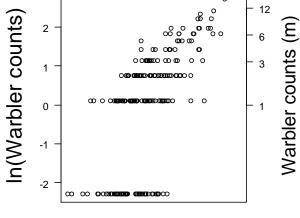
Forest maturity



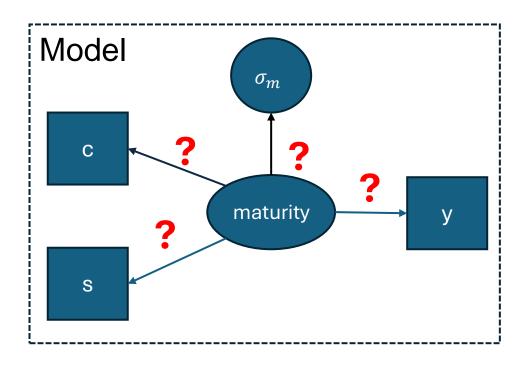
Forest maturity



Forest maturity



Forest maturity

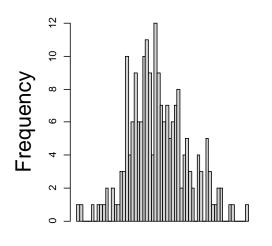


### There's a big problem:

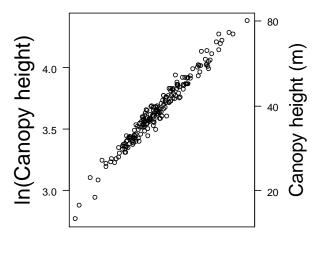
We don't know the range of maturity

 $m \sim \text{normal}(0, \sigma_m^2)$ 

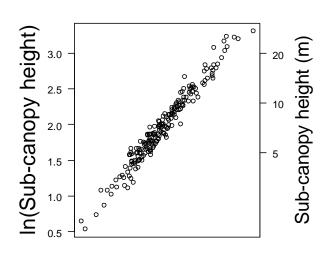
### **Small groups!**



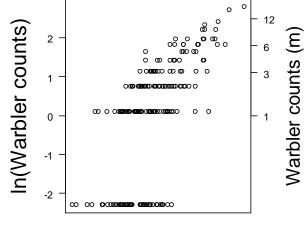
Forest maturity



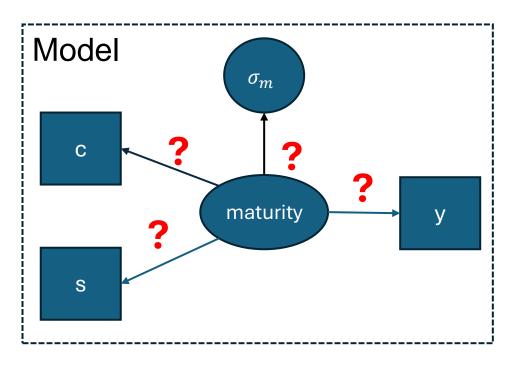
Forest maturity



Forest maturity



Forest maturity

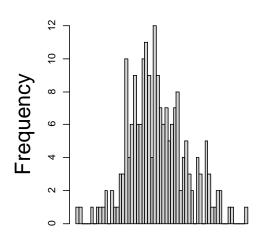


How could we scale maturity, i.e., what should the minimum and maximum values of maturity be?

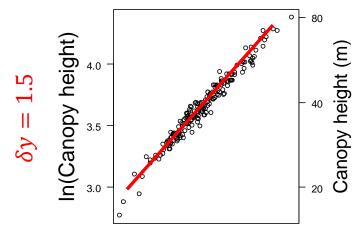
$$\delta y = \delta x \beta$$

 $m \sim \text{normal}(0, \sigma_m^2)$ 

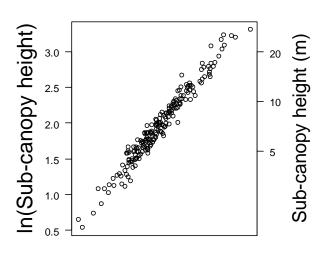
#### What if we fix a beta?



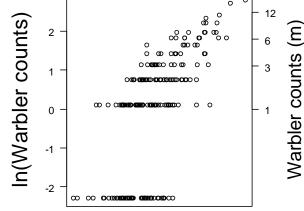
Forest maturity



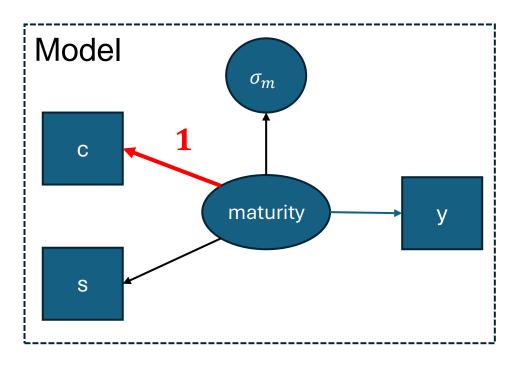
Forest maturity



Forest maturity



Forest maturity

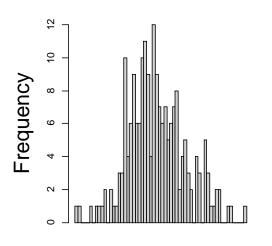


$$\delta y = \delta x \beta$$
$$1.5 = ? \times 1$$

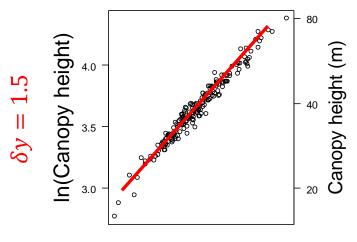
$$1.5 = ? \times 1$$

$$m \sim \text{normal}(0, \sigma_m^2)$$

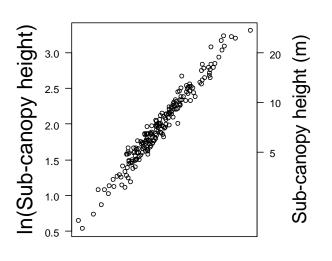
#### Now we can calculate $\sigma_m$



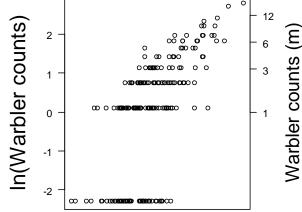
Forest maturity



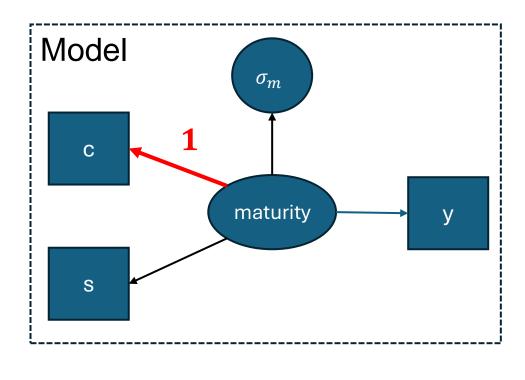
Forest maturity



Forest maturity



Forest maturity

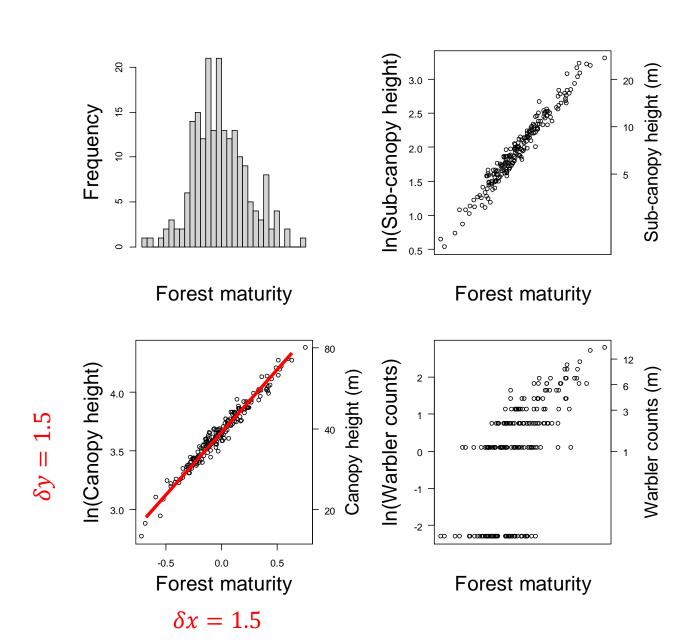


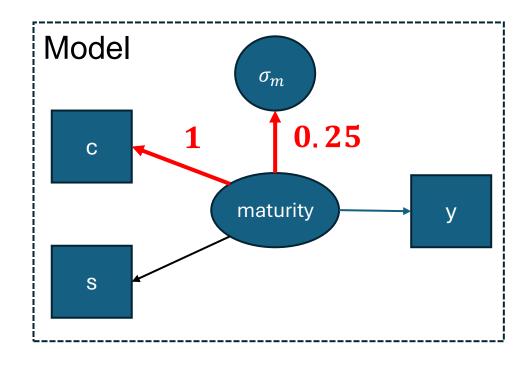
$$\delta y = \delta x \beta$$
$$1.5 = ? \times 1$$

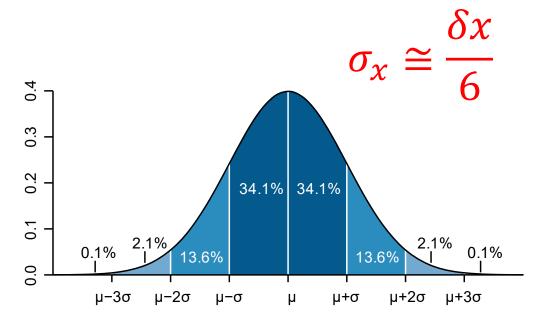
$$1.5 = ? \times 1$$

Our x-axis must have a range of 1.5!

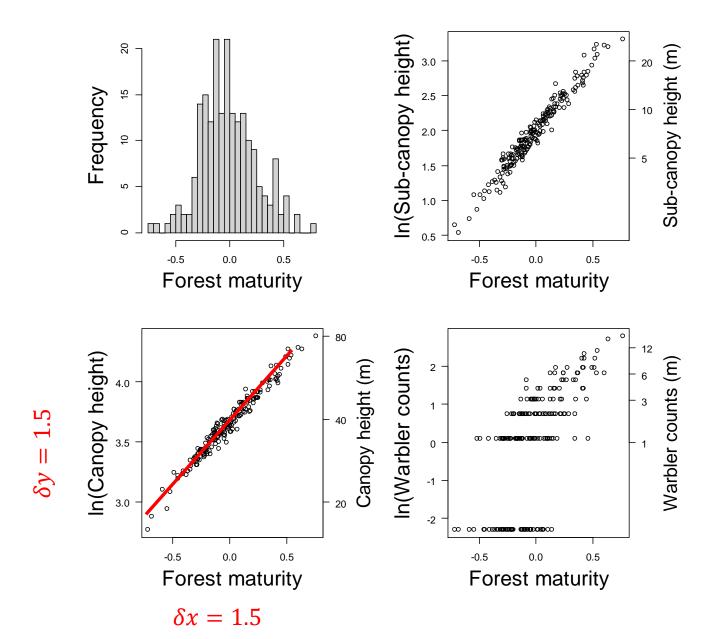
#### Now we have a scale!!

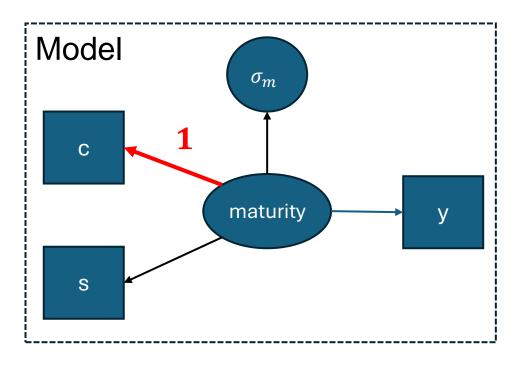






### Now we know the x-axis for everything!

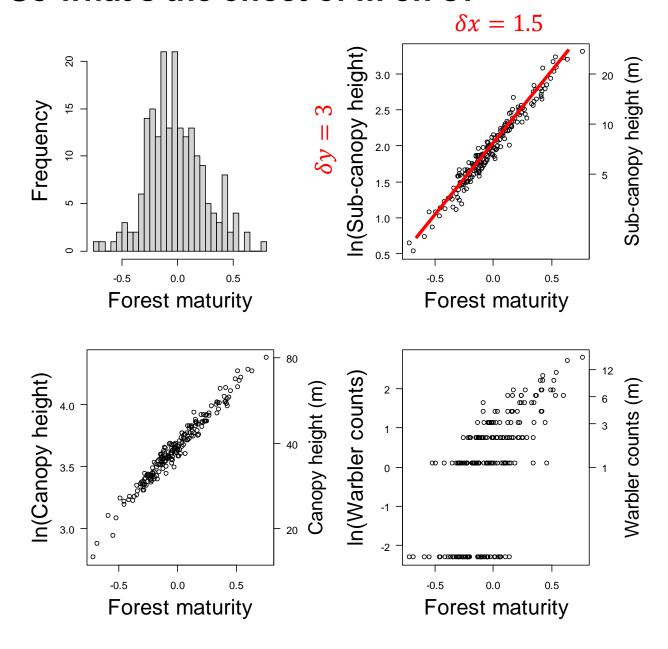


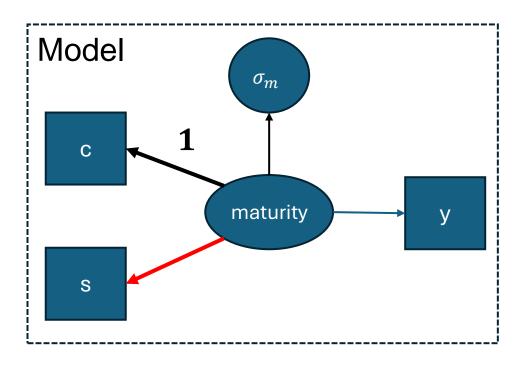


$$\delta y = \delta x \beta$$

$$\delta y = \delta x \beta$$
$$1.5 = 1.5 \times 1$$

#### So what's the effect of m on s?

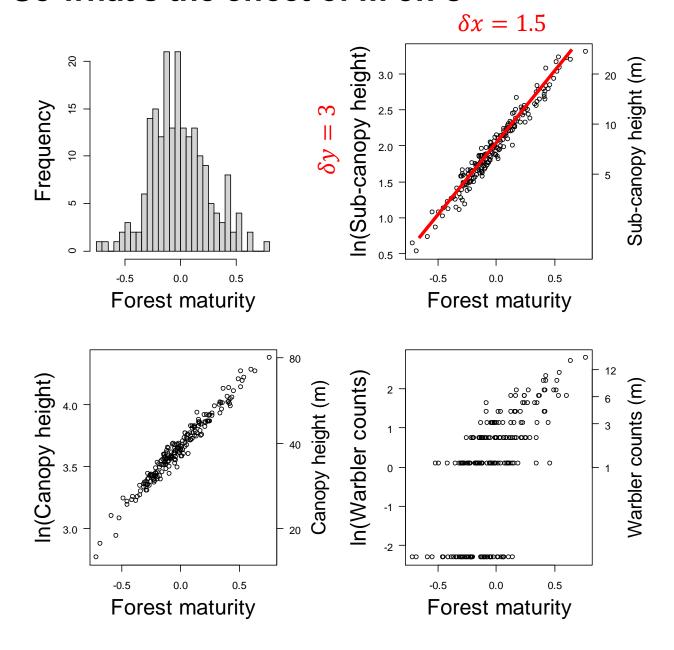


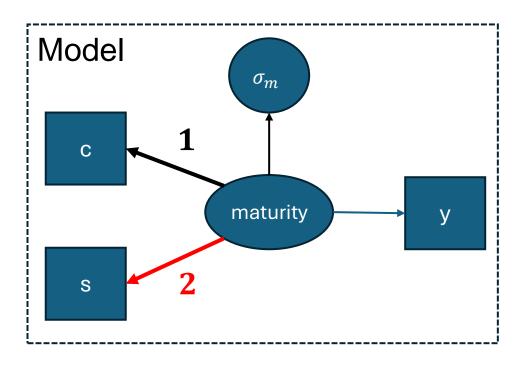


$$\delta y = \delta x \beta$$
$$3 = 1.5 \times ?$$

$$3 = 1.5 \times 3$$

#### So what's the effect of m on s

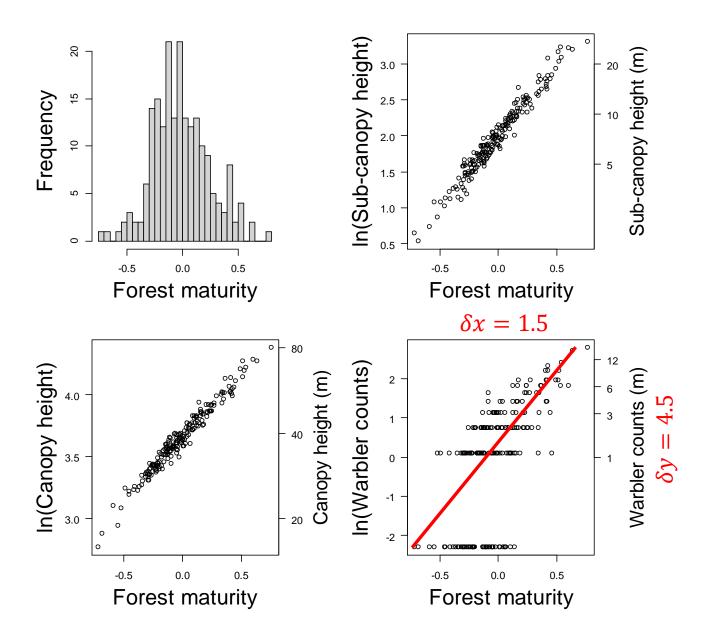


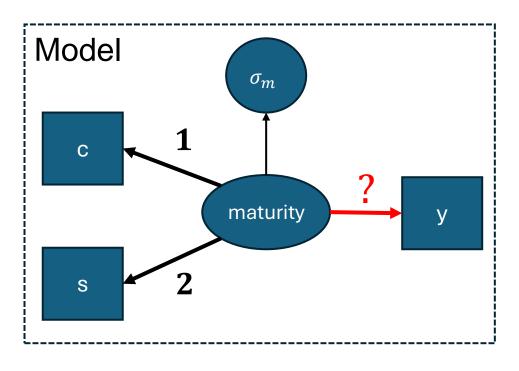


$$\delta y = \delta x \beta$$
$$3 = 1.5 \times 2$$

$$3 = 1.5 \times 2$$

### What about effect of *m* on *y*?

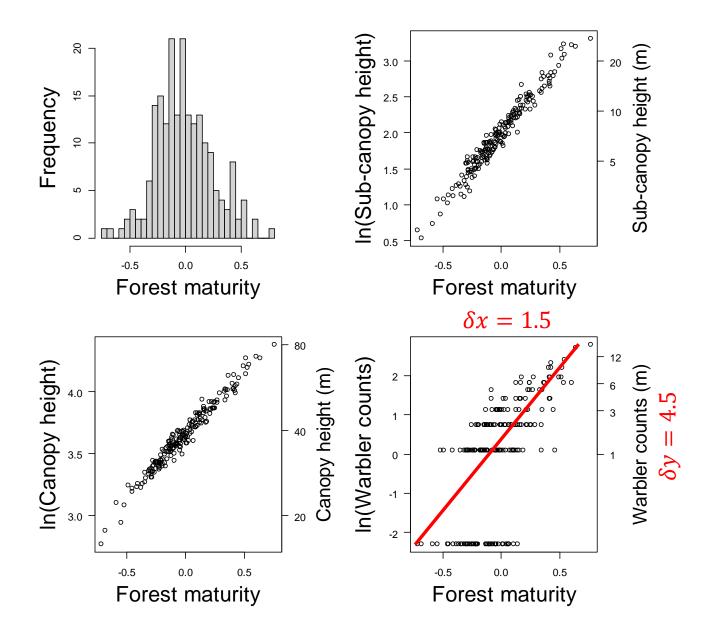


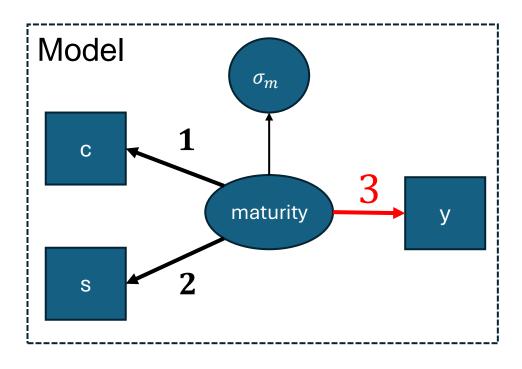


$$\delta y = \delta x \beta$$

$$\delta y = \delta x \beta$$
$$4.5 = 1.5 \times ?$$

### What about effect of *m* on *y*?

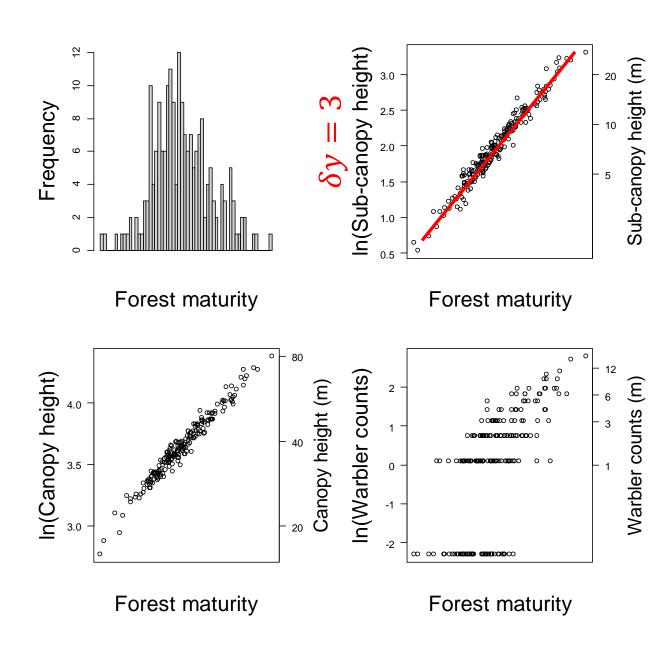


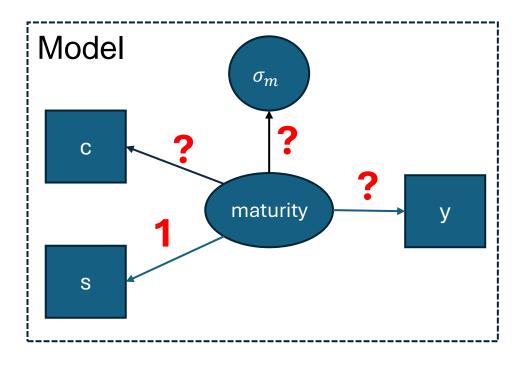


$$\delta y = \delta x \beta$$
$$4.5 = 1.5 \times 3$$

$$4.5 = 1.5 \times 3$$

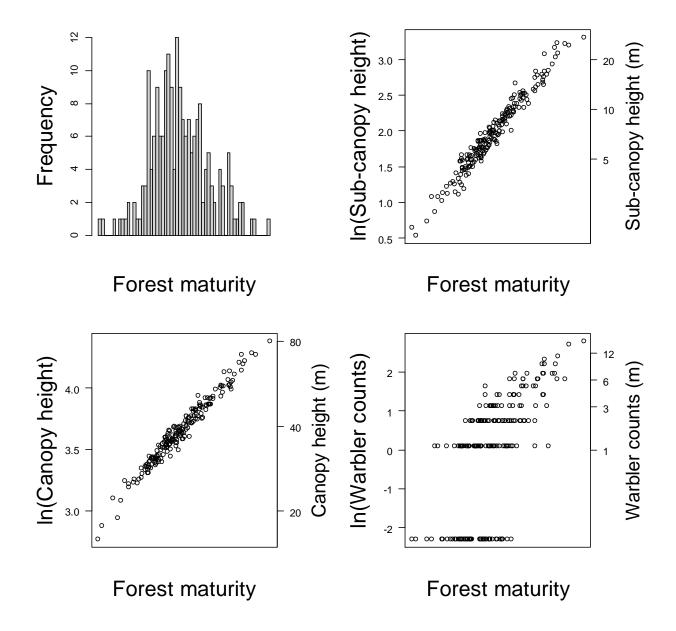
### Let's do it again!!

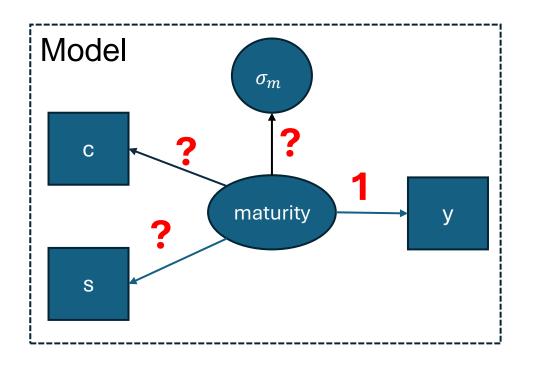




$$\delta y = \delta x \beta$$

### Play with the script some later!



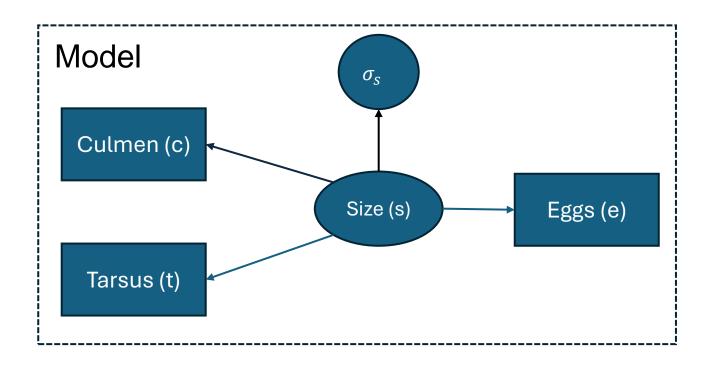


## Today's coding exercise... build a SEM to estimate 'size'

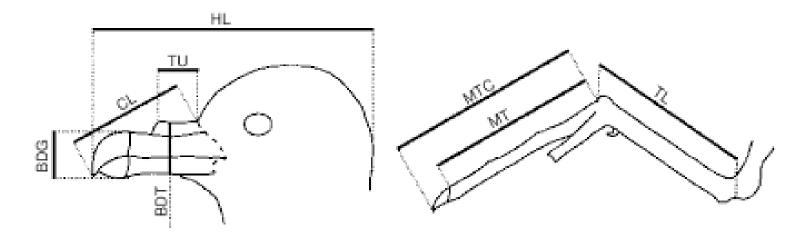


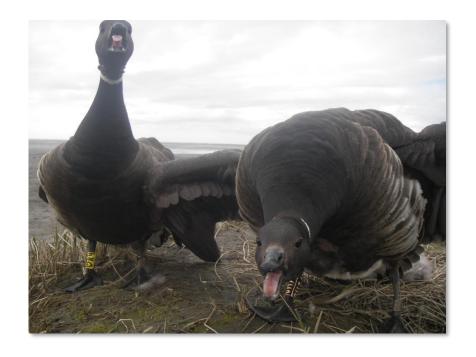
- Adult body size varies by ~25%
- Egg size can range from 50 cm<sup>3</sup> to >100 cm<sup>3</sup>

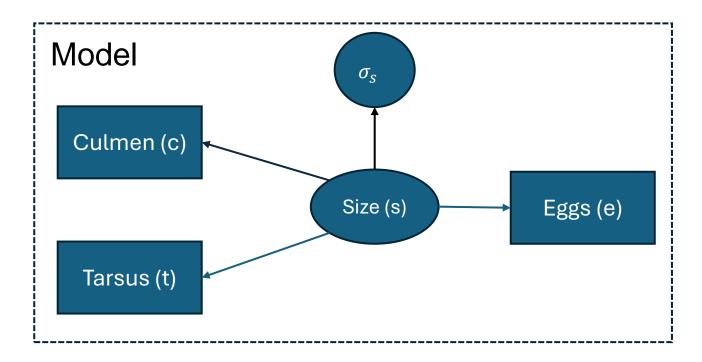




## We take multiple morphometric measurements

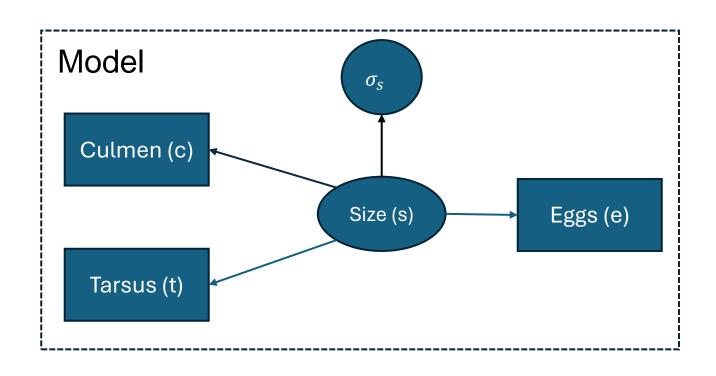






#### And we'll attempt to estimate the effect of size on clutch size





I've left a couple of things 'blank' in the model for you to supply