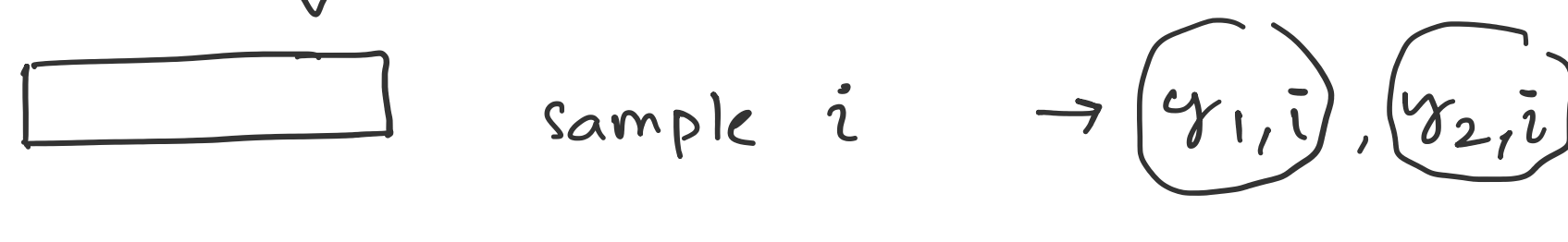


- Assignment due today

Recap

- Hypothesis testing : Random sample method (two sample t-test)
- Random design method (permutation method)

Paired t-test :



	Tip 1	Tip 2	dent
1	$y_{11}$	$y_{21}$	$y_{21} - y_{11}$
2	$y_{21}$	$y_{22}$	.
3			.
⋮			⋮
n			.

$$d_i = y_{2,i} - y_{1,i} \sim N(\mu, \sigma)$$

Null hypothesis : No change between tip 1,2  
 $\mu = 0$

Alternative :  $\mu \neq 0$ , we expect some variation

$$t = \frac{\bar{d} - \mu}{s/\sqrt{n}} \quad s = \frac{\sum (d_i - \bar{d})^2}{n-1}$$

- Randomization for inference : "we looked data we might have if one of our hypothesis is true"
- Bayesian hypothesis testing : our prior knowledge to specify likelihoods of our model and then compute evidences for our model

$$M_0 = N(0, \sigma) ; M_1 = N(\mu, \sigma)$$

$$P(M_0), P(M_1)$$

(assume both are equal  $P(M_0) = P(M_1) = 1/2$ )

$$P(X|M) = \underbrace{P(M)}_{\text{Model evidence}} \underbrace{P(M|X)}_{\text{given data X, likelihood of M being the model to describe it}}$$

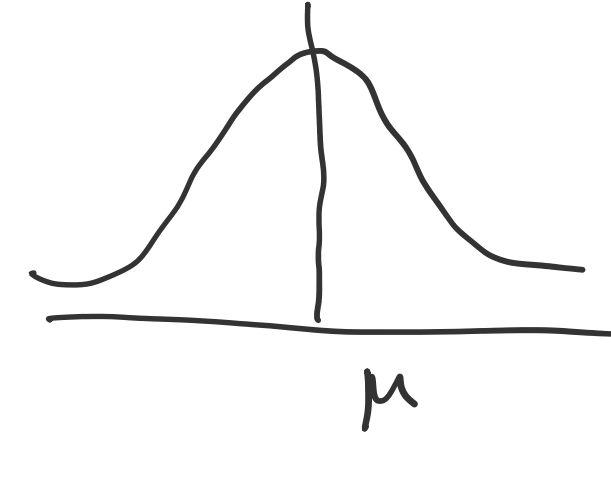
$$M \sim N(\mu, \sigma) \quad P(\mu), P(\sigma) \quad P(\theta = [\mu, \sigma])$$

Bayesian model selection

$$\left[ \text{Bayes factor} = \frac{P(X|M_0)}{P(X|M_1)} \right]$$

- Bootstrap inference: sampling with replacement

$[10, 12, 14, 20, 20] \rightarrow \text{mean}^*$   
Sample :  $[10, 10, 12, 14, 14] \rightarrow \text{mean}^i$



$\rightarrow$  hypothesis testing

$S_M, S_{\text{boot}}$   
 $\downarrow$  bootstrap sample     $\downarrow$  bootstrap sample     $\rightarrow$  t-test to do inference.

- wiki (Bootstrap hypothesis testing, Bayesian model selection, Bayes factor, Bayes information criteria)

- ANOVA (Analysis of Variance)

$\rightarrow$  way of performing a series of paired t-tests

$\rightarrow$  One-way ANOVA

two-way ANOVA

$$i \rightarrow \bar{e}_0 \quad e_1 \quad \bar{e}_2 \quad \dots \quad e_t$$

perform a paired t-test between  $i (e_0, e_1)$

levels in two ways : Fixed levels  
Random effect levels

- gender (vs) salary (independent variable) (dependent variable)

- Null hypothesis : no difference across levels

$$M_0, M_1, \dots, M_M$$

$$H_0 : \mu_0 = \mu_1 = \dots = \mu_M$$

$H_1$  : at least one of  $\mu_i$  is different irrespective of which level it is

- ANOVA ;  $y_{ij} = \alpha + \beta_j + \epsilon_{ij}$

$i^{\text{th}}$  subject and undergoing  $j^{\text{th}}$  treatment

$$\epsilon_{ij} \sim N(0, \sigma) \quad \text{some variance across the different treatment } (S_e^2)$$

$\beta_j \neq 0$   $\beta_j \rightarrow$  How much of a variation the level  $j$  contributes to the mean response  $\alpha$  (not purely random sampling)

- sensitivity testing