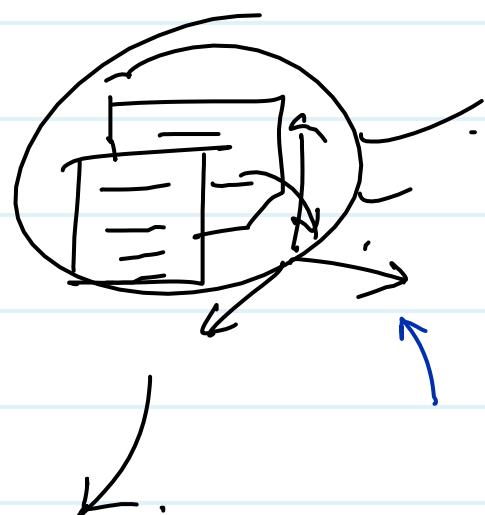


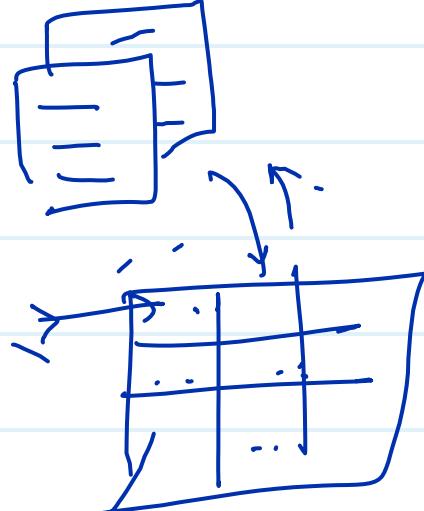
①

## FINE TUNING



~~chat~~ = { Ans } :

FINE TUNING : →

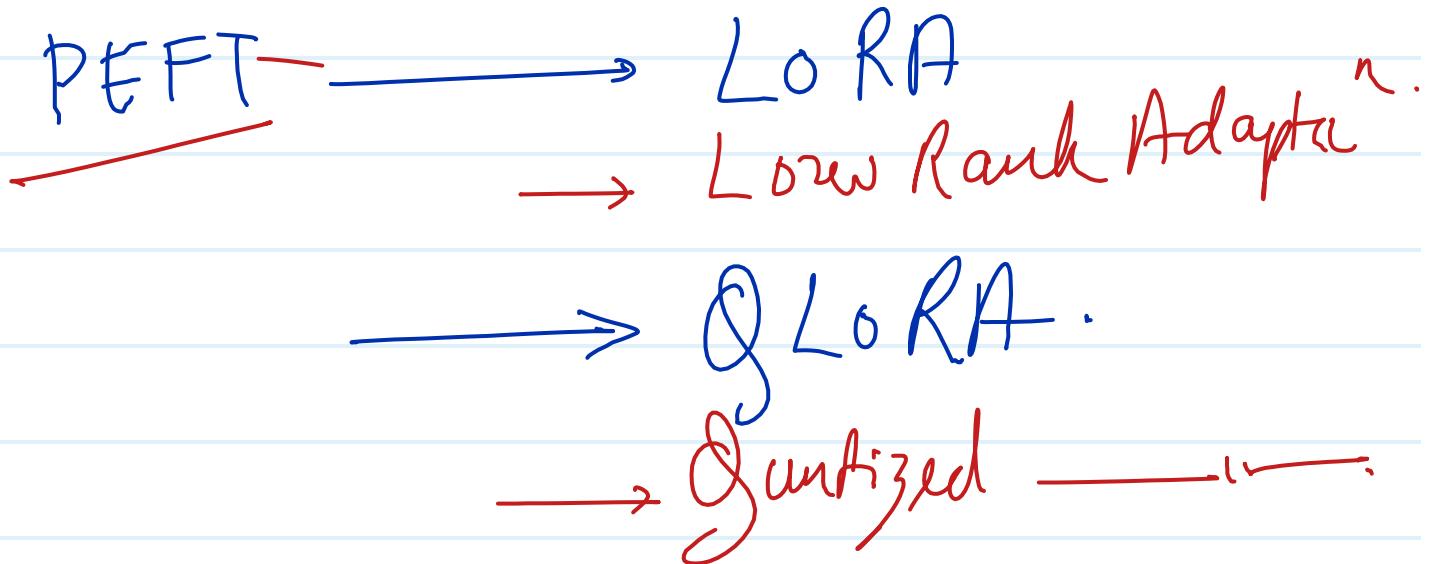
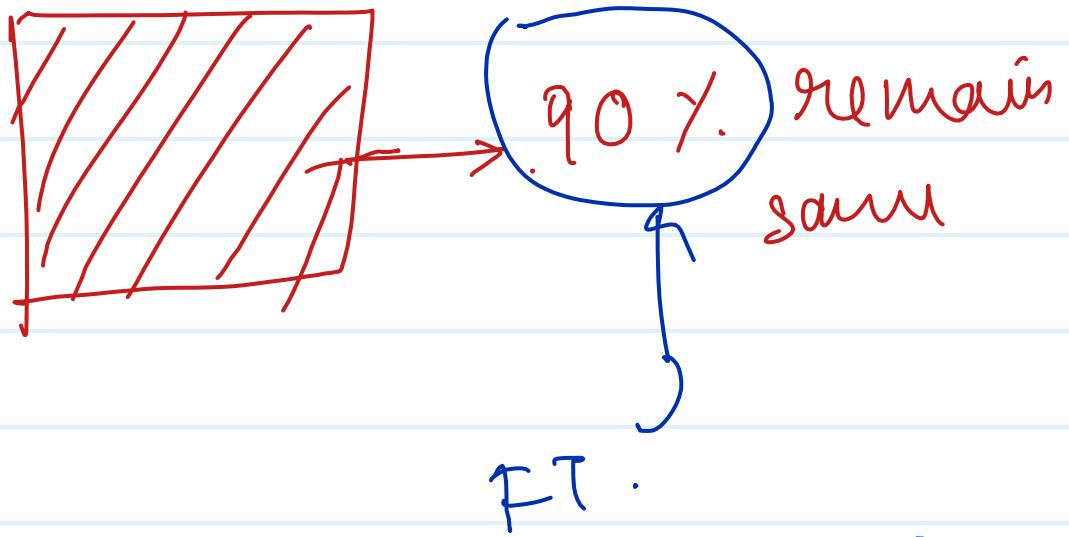


→ COMPLEX.  
★ . REASONING.

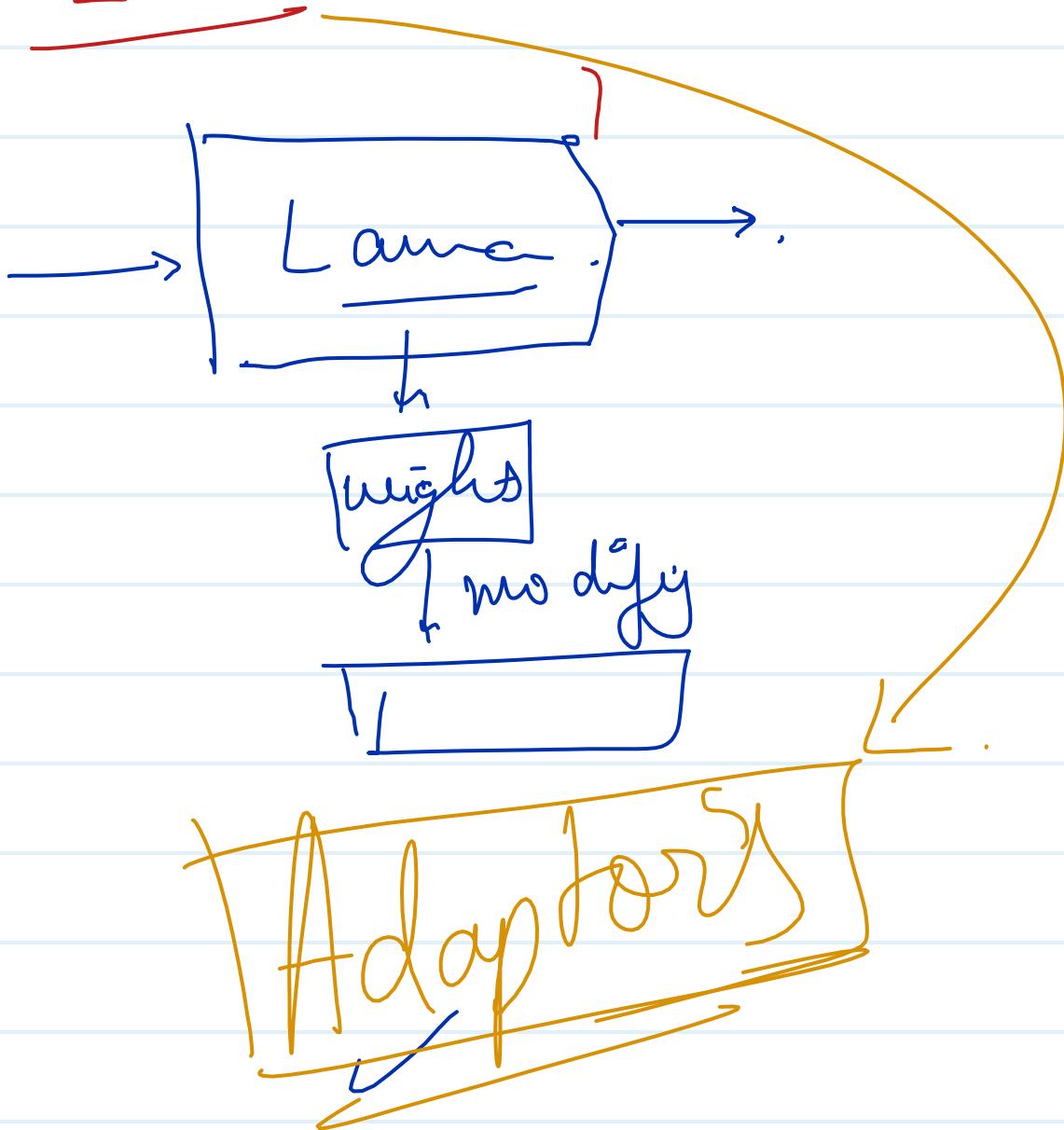
→ Specific output (JSON) ↵

→ Interleave ↵

PEFT ← {Parameter Efficient} -  
 FT..

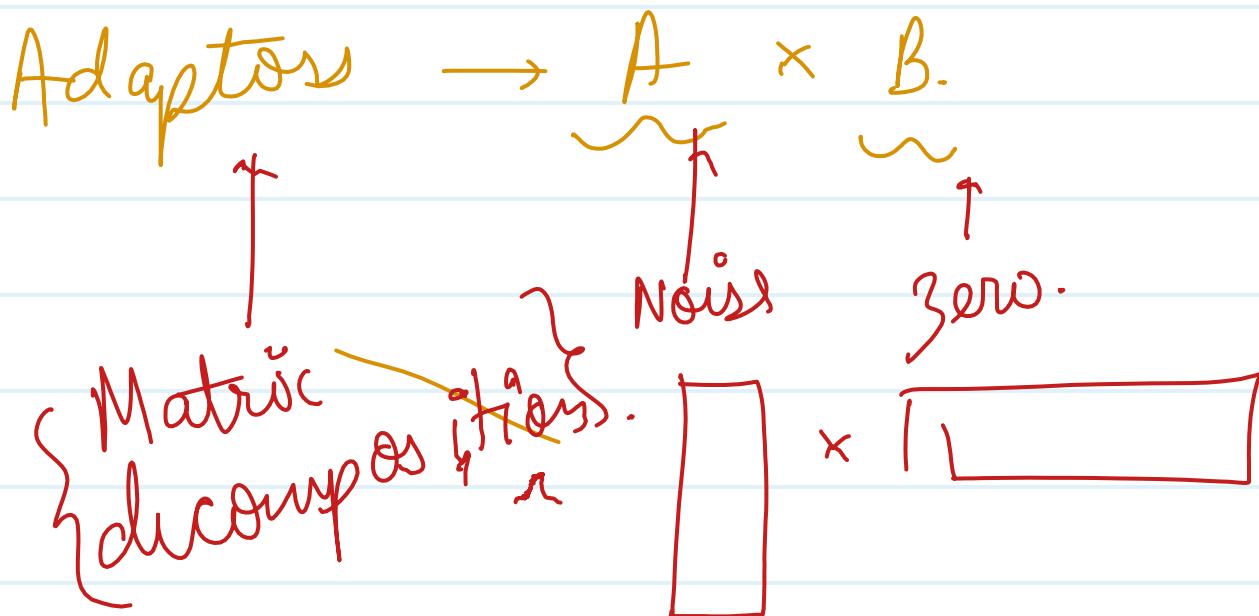


# LORA:



$$W_{\text{new}} = W_{\text{old}} + \underbrace{\begin{bmatrix} w \\ t \end{bmatrix}}_{\rightarrow} - \underbrace{\begin{bmatrix} w \\ t \end{bmatrix}}_{\rightarrow}$$





Word ⇒  $(4096 \times 4096)$ .

$A \times B \Rightarrow A \rightarrow (4096 \times \textcircled{?})$

$B \rightarrow (\textcircled{?} \times 4096)$ .

Rank ⇒  $\textcircled{?} = 1$ .

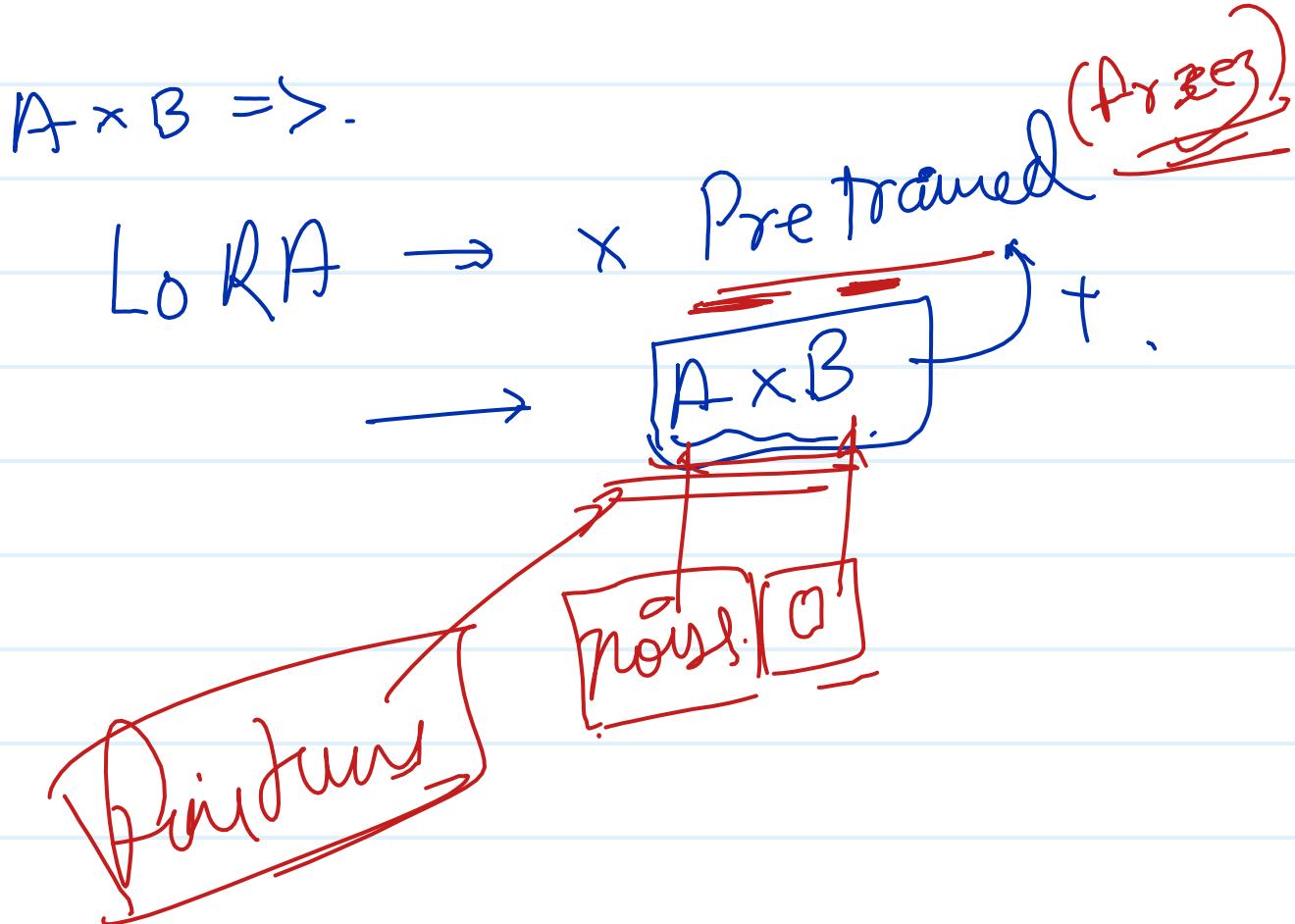
$A \rightarrow (4096 \times 1)$

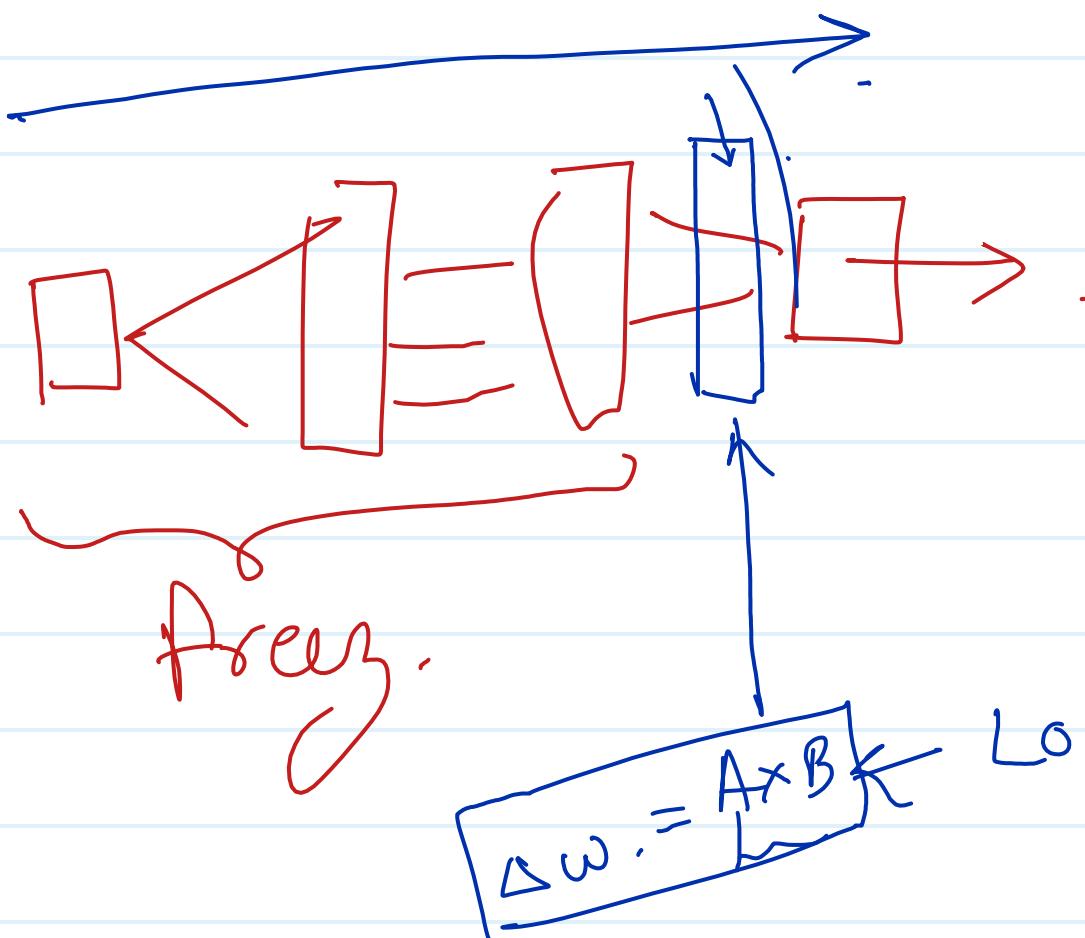
$B \rightarrow (1 \times 4096)$

$$A \times B = 16 \text{ million}$$

$(n \times m)$        $(m \times p)$

1                  1





$$A \rightarrow 4096 + 1 = 4096$$

$$B \rightarrow -1 \times 4096 = +4096$$

Pretrained  $\rightarrow 4096 \times 4096$   
 $\Rightarrow 16\text{ million}$

$$\overbrace{\quad}^{\sim 9000} \uparrow$$

Ally in  $B = \text{Zero } M - 1$

$$A \times B = 0.$$

$\text{Zero.} \Rightarrow 0 \rightarrow 0 - 001,$

$$W_{\text{new}} = W_{\text{old}} + \Delta w$$

$$= 0$$

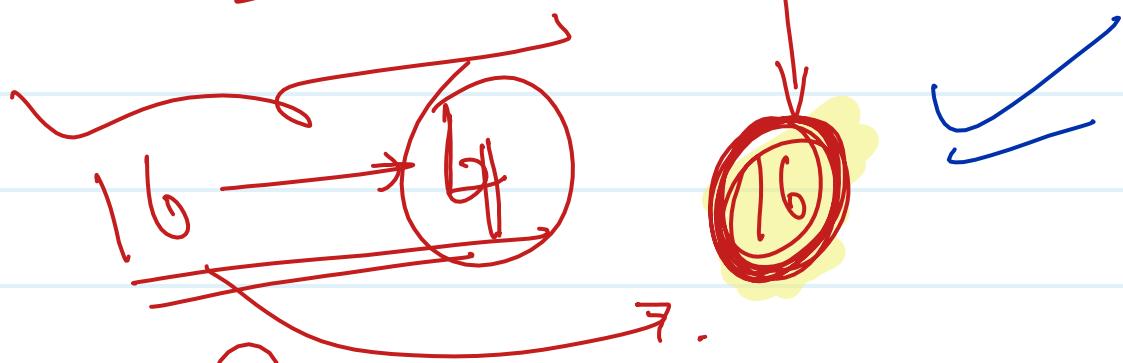
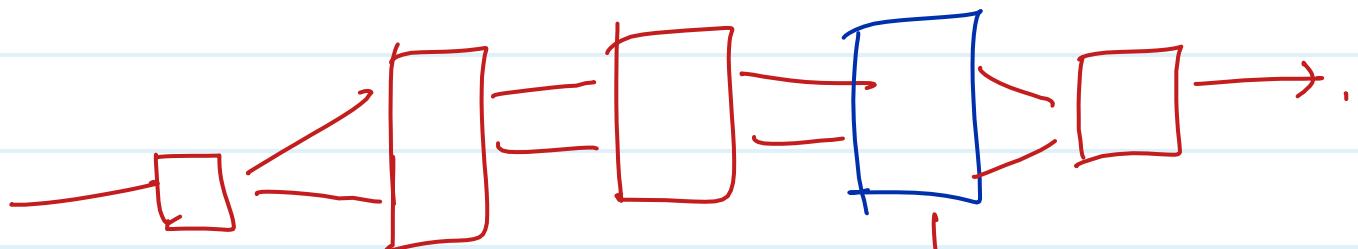
$w$  ← training

# Q + LORA

→ QG. → 16 bit

↓ Quantize  
4 bit

Quantize → Pretrained (e.g.  $6 \rightarrow 4$ )  
 → bits & keys lib.



→ Storage Computation

GPU ← chunks  $\leftarrow \begin{cases} 10^0 \\ 10^1 \end{cases}$  (16) pre fine

dequantize  
 $4 \rightarrow 16 \leftarrow$  instance

Fördel  $\Rightarrow \omega_h = \omega_0 + \frac{\Delta\omega}{\gamma}$  ( $\Delta\omega$ )  
 $\uparrow$   
 $\frac{A \times B}{\gamma}$ .

Thens rule:  $\alpha = 2\gamma \cdot$

$$\gamma \approx 16.$$