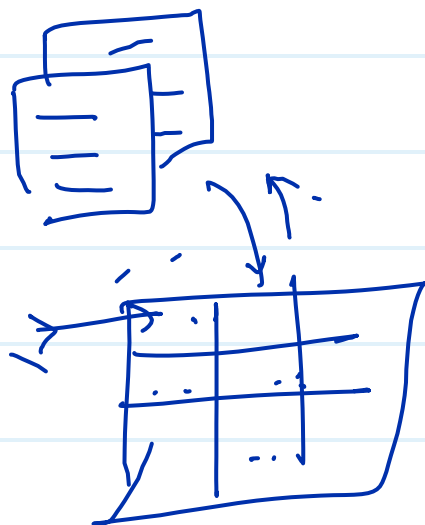


①

→ FINE TUNING

RAG

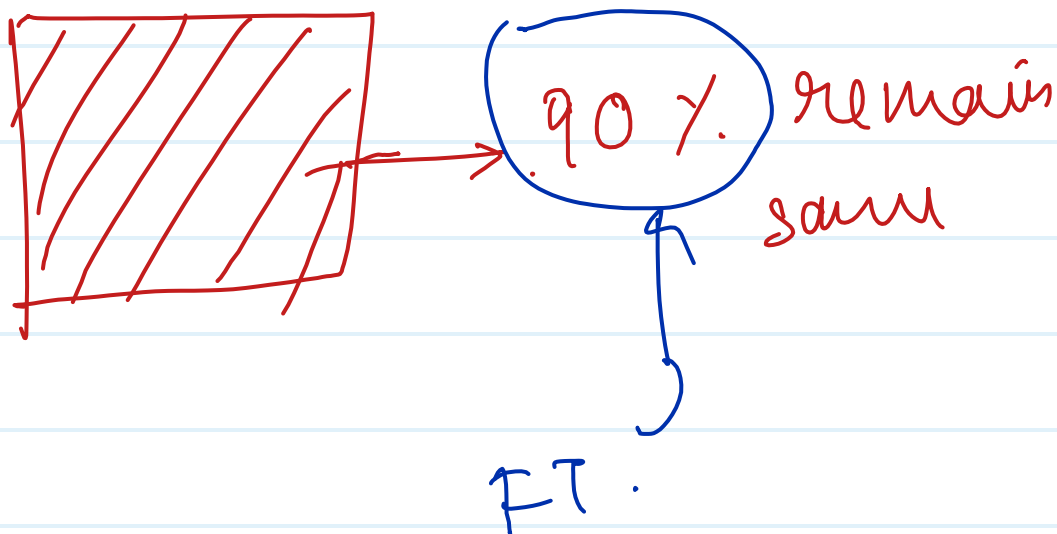
data} Ans :FINE TUNING :

→ COMPLEX.

• REASONING.→ Specific output (JSON) ←

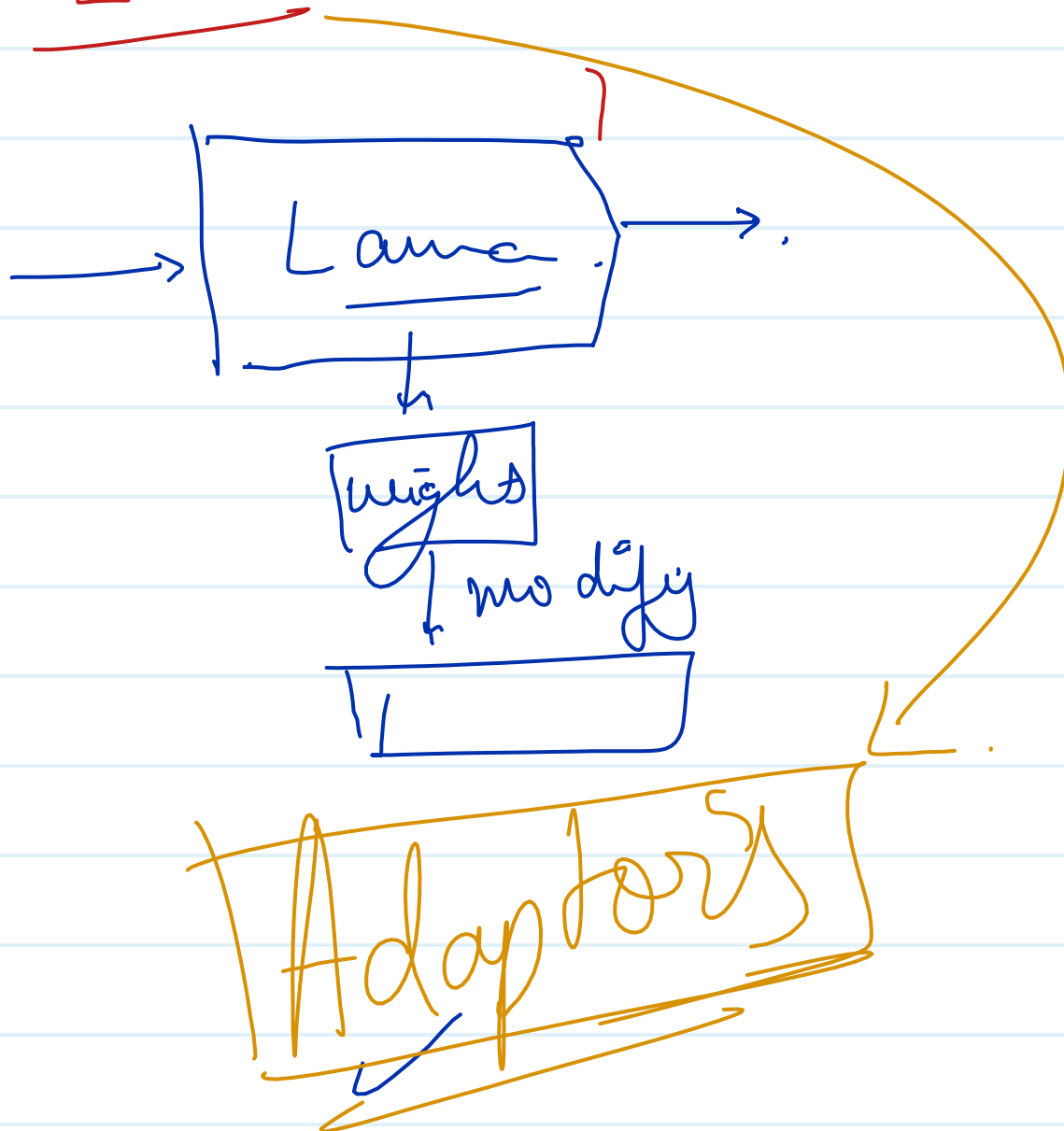
→ Interview ←

PEFT $\leftarrow \left\{ \frac{\text{Parameter}}{\text{F.T.}} \text{ efficient} \right\}$.



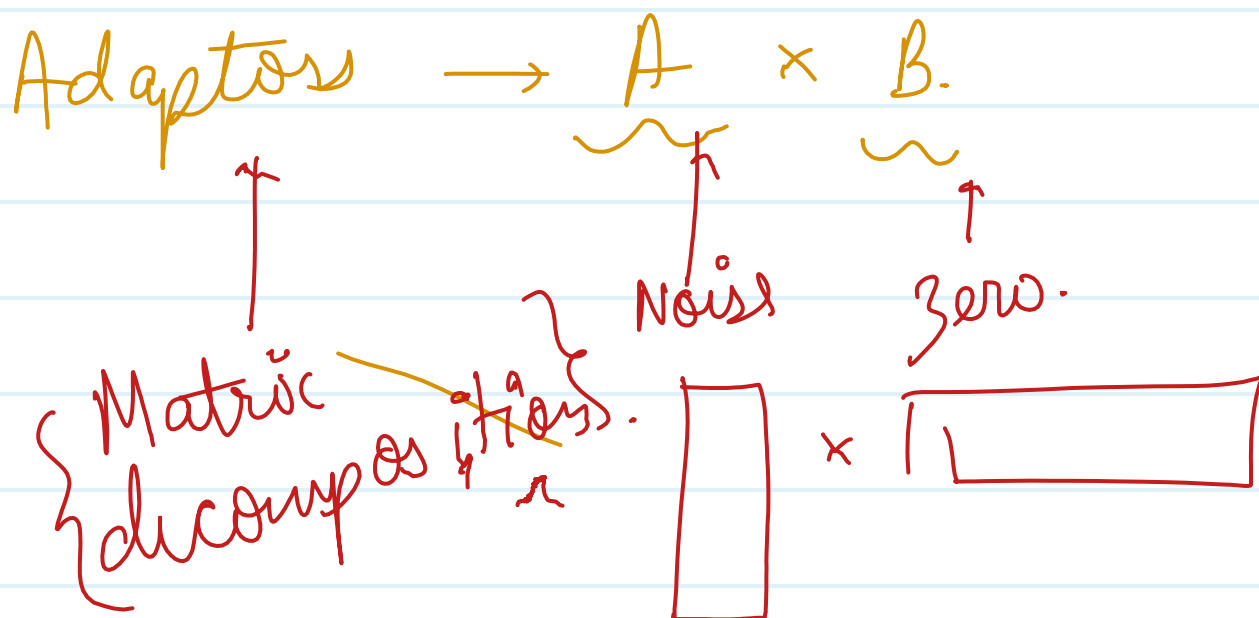
PEFT \rightarrow LoRA
 \rightarrow Low Rank Adaptation.
 \rightarrow QLoRA.
 \rightarrow Quantized

LoRA:



$$\underline{W_{\text{new}}} = \underline{W_{\text{old}}} + \boxed{\underline{W}}_{(r)}$$

(n, m)



Wold $\Rightarrow (4096 \times 4096)$.

$A \times B \Rightarrow A \rightarrow (4096 \times \sigma)$

$B \rightarrow (\sigma \times 4096)$.

Rank $\Rightarrow \sigma = 1$.

$A \rightarrow (4096 \times 1)$

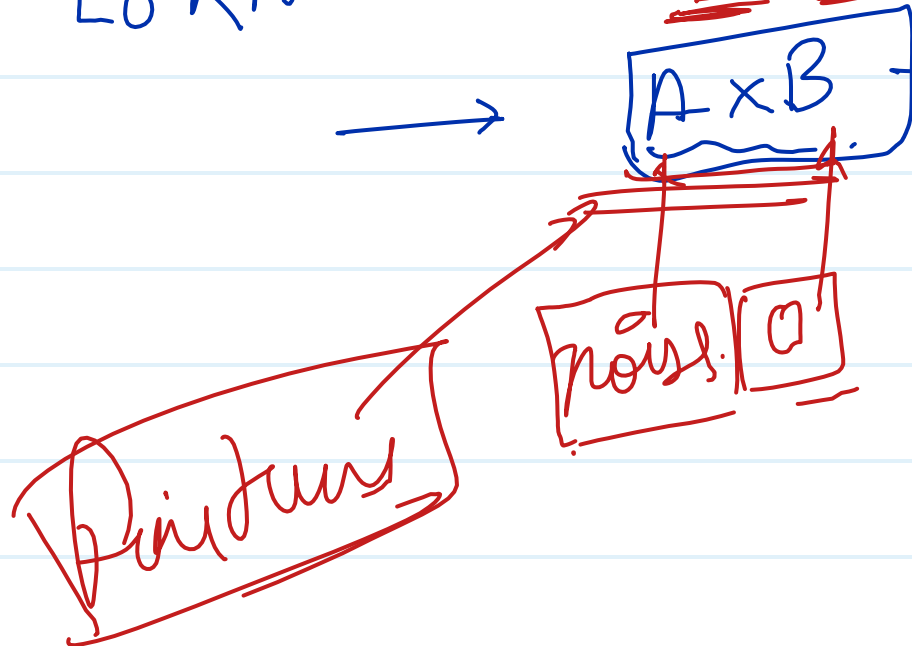
$B \rightarrow (1 \times 4096)$

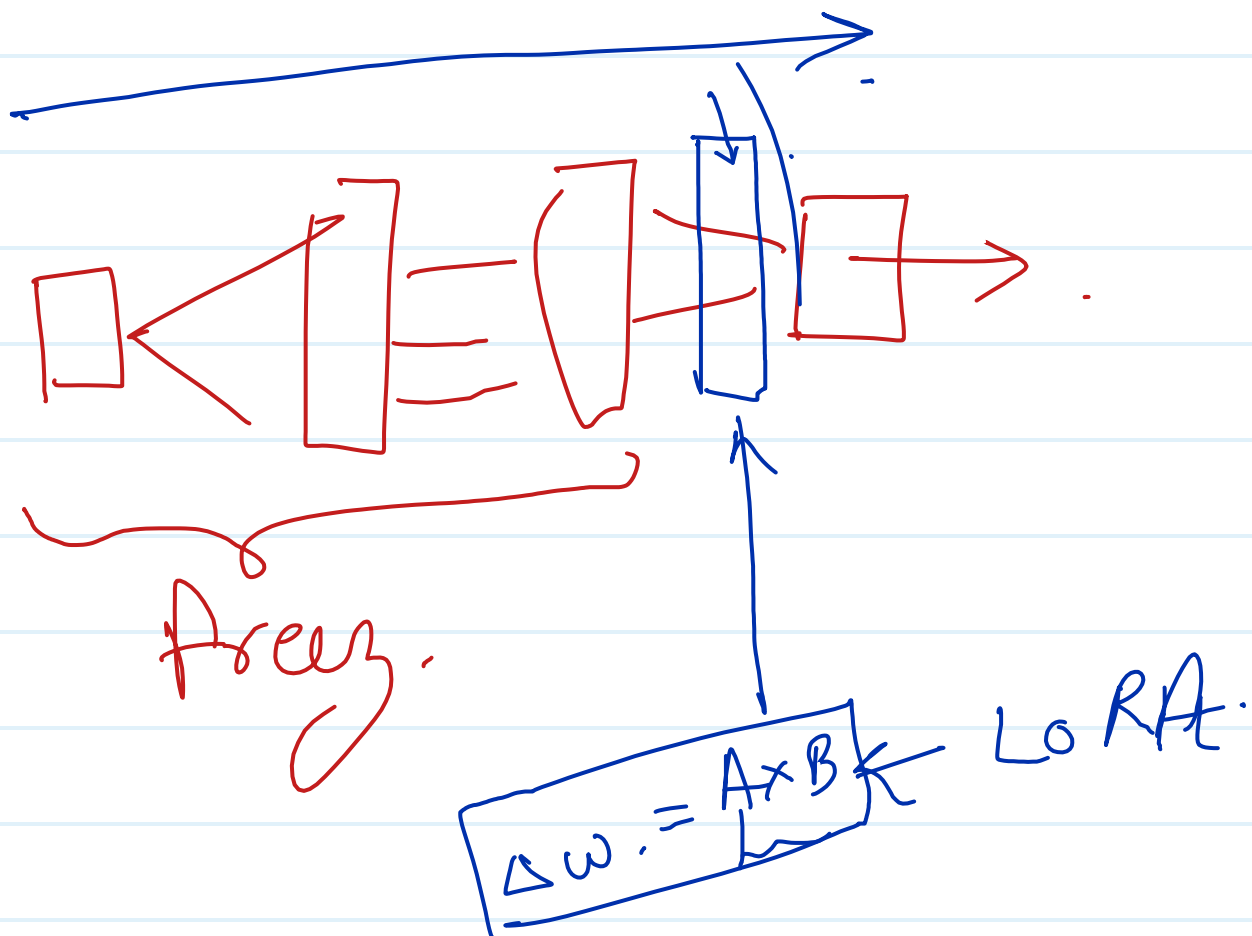
$$A \times B = 16 \text{ billion}$$

$(n \times m)$ $(m \times p)$
 \downarrow \downarrow

$$A \times B \Rightarrow .$$

LoRA \rightarrow \times Pre trained (Frozen)





$$A \rightarrow 4096 \times 1 = 4096$$

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

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

$$\sim 9000$$

Why is $B = \text{zero } M-1$

zero $\rightarrow 0 \rightarrow 0-001,$

$$A \times \underline{\underline{B}} = 0.$$

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

$$= 0$$

\leftarrow no training

LoRA

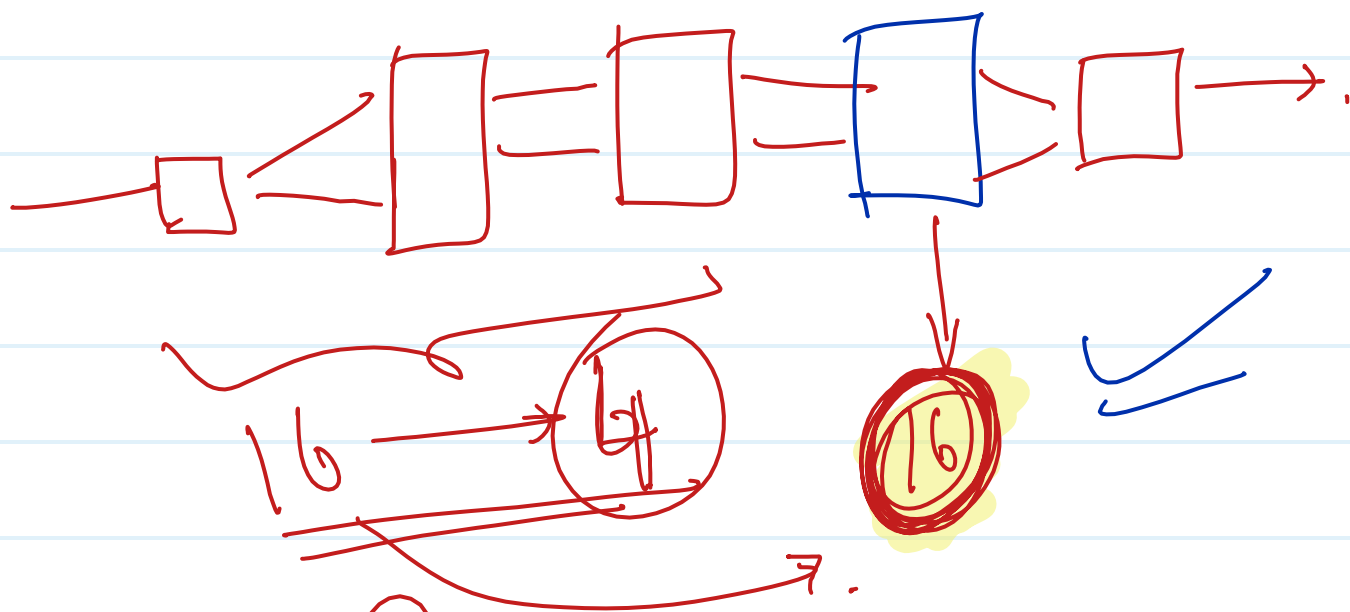
\rightarrow e.g. \rightarrow

16 bit

quantize

4 bit

Quantize \rightarrow Preround (e.g. $6 \rightarrow 4$)
 \rightarrow bits & bytes lib.



\rightarrow Storage
 \rightarrow Computation

GPU \leftarrow chunks $\leftarrow \begin{pmatrix} 10 & 0 \\ 10 & (4) \end{pmatrix}$ \leftarrow pre time (16).

dequantize
 $4 \rightarrow 16 \leftarrow$ instance

Therms rule: $\alpha = 2\gamma$.

$\gamma \approx 16.$