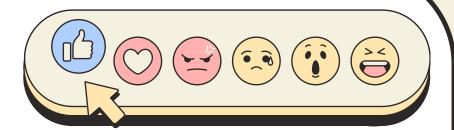


ATTENTION!



ससादि

AMAN K. FOUJDAR





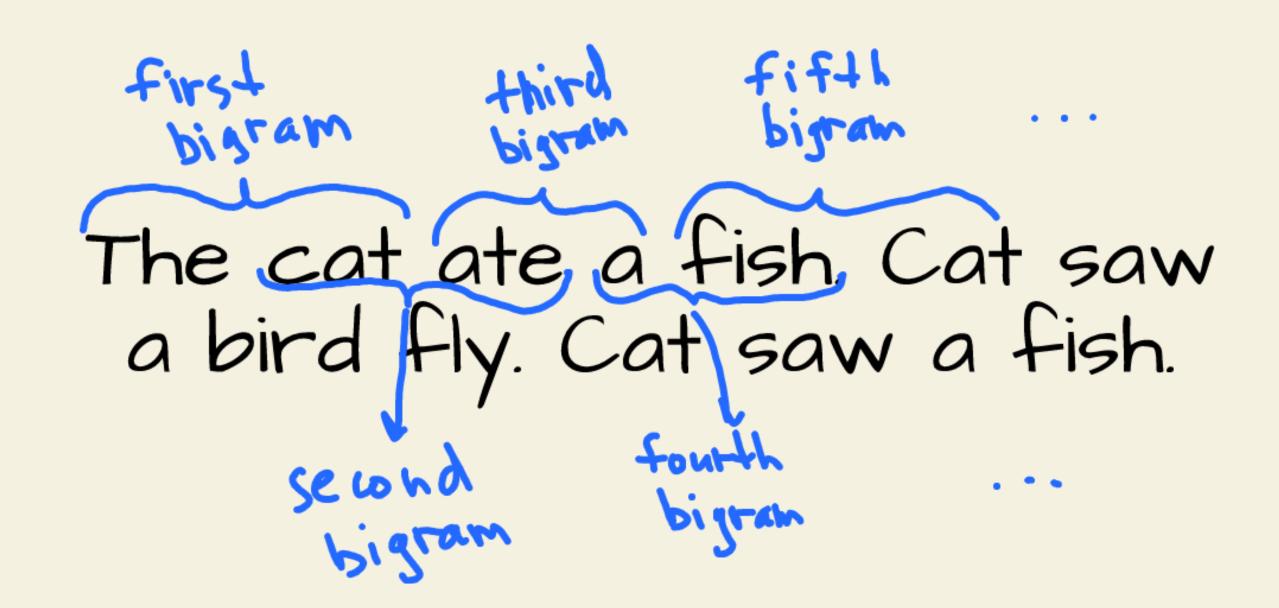




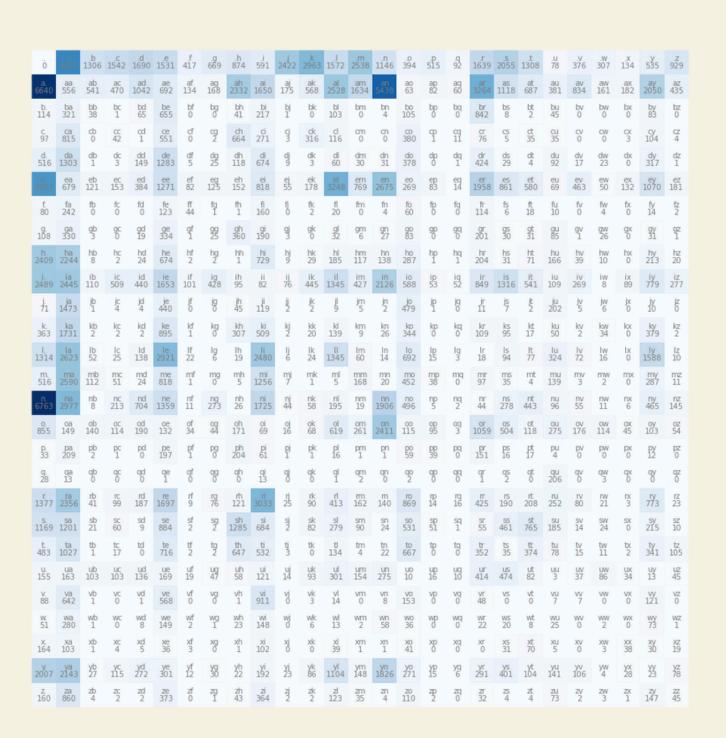
IML: PROF SANDEEP JUNEJA



BIGRAM MODELS



BIGRAM MODELS



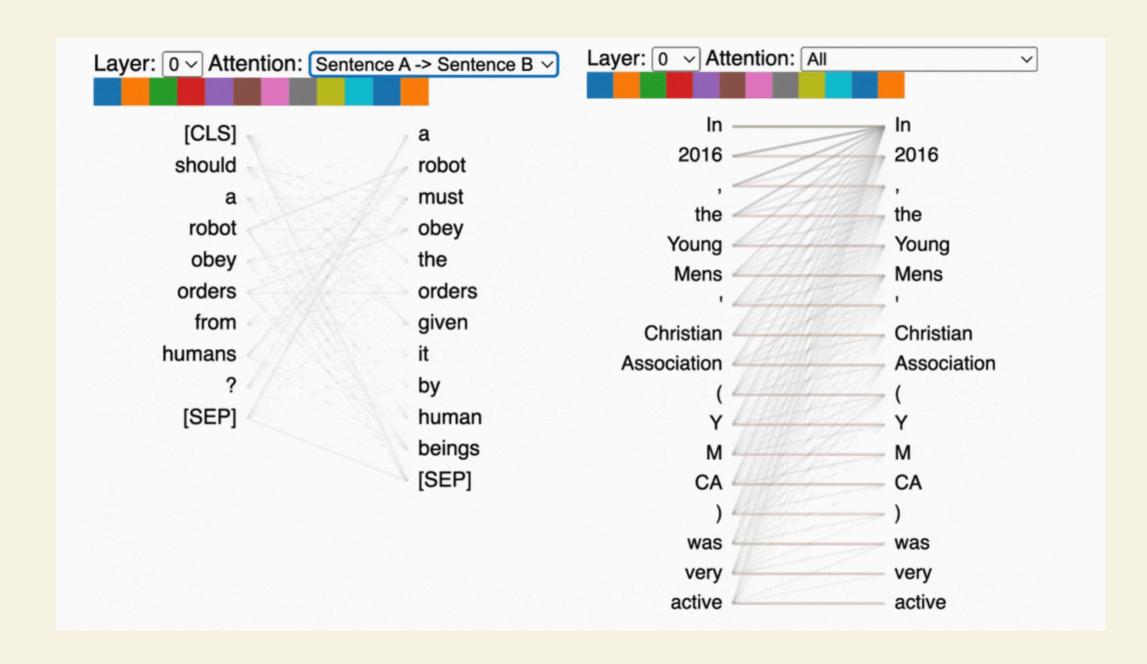
```
for w in words:
    chs = ['.'] + list(w) + ['.']
    for ch1, ch2 in zip(chs, chs[1:]):
        ix1 = stoi[ch1]
        ix2 = stoi[ch2]
        N[ix1, ix2] += 1
```

BIGRAM MODELS

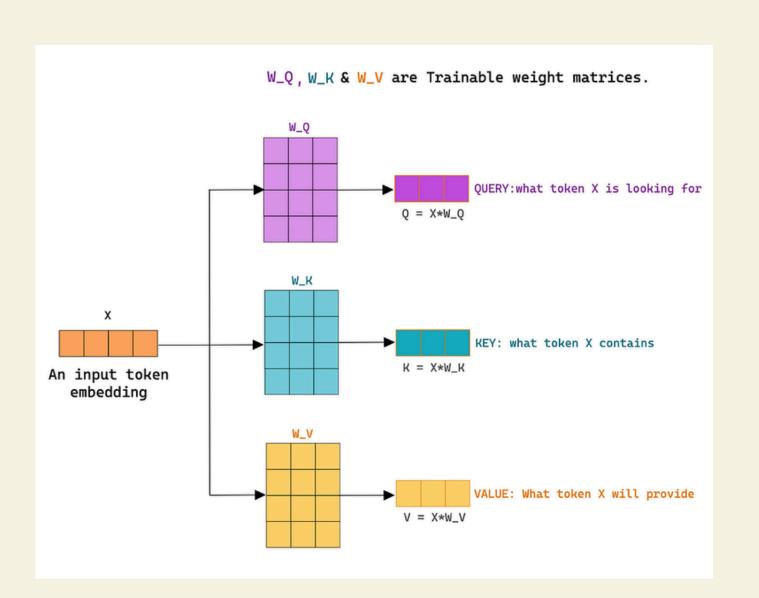
```
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```

BORUM ROLLS

ATTENTION

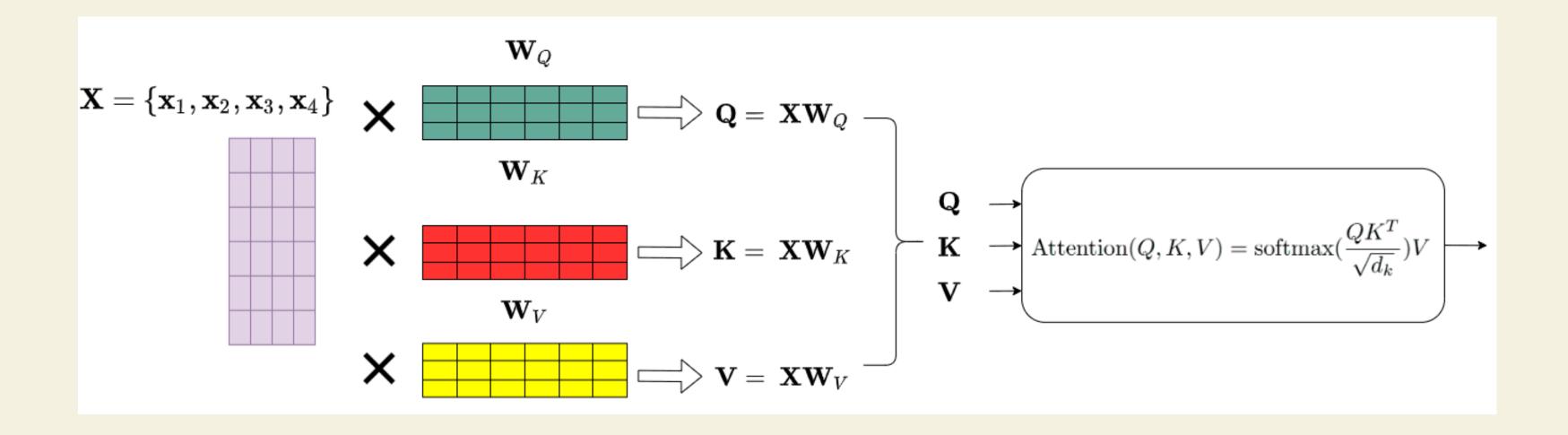


SELF ATTENTION



```
#singkle head of attention
class Head(nn.Module):
    def __init__(self, head_dim):
        super().__init__()
        self.key = nn.Linear(EMBEDDING_DIM, head_dim, bias=False)
        self.query = nn.Linear(EMBEDDING_DIM, head_dim, bias=False)
        self.value = nn.Linear(EMBEDDING_DIM, head_dim, bias=False)
        self.register_buffer('tril', torch.tril(torch.ones(CONTEXT_WINDOW, CONTEXT_WINDOW)))
        self.dropout = nn.Dropout(DROPOUT_RATE)
    def forward(self, x):
        #here B-> batch, T -> time-step, C -> channels
        B, T, C = x.shape
        k, q, v = self.key(x), self.query(x), self.value(x) # dimession of this is (B,T,HeadSize)
        # compute attention scores ("affinities")
       attention_scores = (q @ k.transpose(-2, -1)) * k.shape[-1]**-0.5
        attention_scores = attention_scores.masked_fill(self.tril[:T, :T] == 0, float('-inf'))
        attention_probs = F.softmax(attention_scores, dim=-1)
        attention_probs = self.dropout(attention_probs)
        return attention_probs @ v
```

SELF ATTENTION



Decoder FC. Add & norm Positionwise FFN. Encoder Add & norm Add & norm $1 \times n$ Muti-head attention Positionwise FFN Add & norm $n \times$ Add & norm Masked Multi-head multi-head attention attention Positional Positional encoding encoding Embedding Embedding Sources Targets

TRANSFORMER

```
class Block(nn.Module):
    def __init__(self, EMBEDDING_DIM, HEADS):
    File display    per().__init__()
        head_size = EMBEDDING_DIM // HEADS
        self.mha = MultiHeadAttention(HEADS, head_size)
        self.ffwd = FeedForward(EMBEDDING_DIM)
        self.ln1 = nn.LayerNorm(EMBEDDING_DIM)
        self.ln2 = nn.LayerNorm(EMBEDDING_DIM)

    def forward(self, x):
        x = x + self.mha(self.ln1(x))
        x = x + self.ffwd(self.ln2(x))
        return x
```

सस्ताGPT 10M

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सस्ताSTOIC

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-DEEPSEK?

```
10.713691 M parameters

: train loss 4.4460, val loss 4.4495

00: train loss 2.1563, val loss 2.2279

step 1000: train loss 2.0441, val loss 2.1356

step 1500: train loss 1.9811, val loss 2.0880

step 2000: train loss 1.9382, val loss 2.0526

step 2500: train loss 1.8820, val loss 2.0114

step 3000: train loss 1.8584, val loss 1.9786

step 3500: train loss 1.8271, val loss 1.9861

step 4000: train loss 1.8289, val loss 1.9594

step 4500: train loss 1.7941, val loss 1.9273

step 4999: train loss 1.7831, val loss 1.9317
```

