

# P0 - Sistemas de Recomendación

## 1 Introducción

## 2 ¿Cómo hicimos?

Usamos dos modelos.

### 2.1 Modelo de reputación

### 2.2 Modelo de Filtrado colaborativo <sup>1</sup>

$$B = AA'$$

hola

## 3 Evaluacion

```
1
2 # marcos pongo esto por si nos hace falta usar codigo python, si no
  lo quitamos
3
4 class Attention(nn.Module):
5     def __init__(self, dim, heads=8, dim_head=64, dropout=0., order
      ='first'):
6         super().__init__()
7         inner_dim = dim_head * heads
8         project_out = not (heads == 1 and dim_head == dim)
9
10        self.heads = heads
11        self.scale = dim_head ** -0.5
12        self.order = order # 'first' or 'second'
13
14        self.attend = nn.Softmax(dim=-1)
15        self.dropout = nn.Dropout(dropout)
16
17        self.qkv = nn.Linear(dim, inner_dim, bias=False)
18
19        self.to_out = nn.Sequential(
```

<sup>1</sup>[https://en.wikipedia.org/wiki/Collaborative\\_filtering](https://en.wikipedia.org/wiki/Collaborative_filtering)

```

20         nn.Linear(inner_dim, dim),
21         nn.Dropout(dropout)
22     ) if project_out else nn.Identity()
23
24     def forward(self, x):
25         w = rearrange(self.qkv(x), 'b n (h d) -> b h n d', h=self.
heads)
26
27         # Compute  $(U^T Z)^T (U^T Z)$ 
28         dots = torch.matmul(w, w.transpose(-1, -2)) * self.scale
29
30         if self.order == 'first':
31             # First-order Neumann approximation
32             # out =  $(U^T Z) * \text{softmax}((U^T Z)^T (U^T Z))$ 
33             attn = self.attend(dots)
34             attn = self.dropout(attn)
35             out = torch.matmul(attn, w)
36
37         elif self.order == 'second':
38             # Second-order Neumann approximation
39             # out = out_1st - out_2nd
40
41             # First order term:  $(U^T Z) * \text{softmax}((U^T Z)^T (U^T Z))$ 
42             attn_1st = self.attend(dots)
43             attn_1st = self.dropout(attn_1st)
44             out_1st = torch.matmul(attn_1st, w)
45
46             # Second order term:  $(U^T Z) * \text{softmax}(((U^T Z)^T (U^T Z))^2)$ 
47             # Compute  $((U^T Z)^T (U^T Z))^2$ 
48             dots_2nd = torch.matmul(dots, dots)
49             attn_2nd = self.attend(dots_2nd)
50             attn_2nd = self.dropout(attn_2nd)
51             out_2nd = torch.matmul(attn_2nd, w)
52
53             # Combine: subtract second order correction
54             out = out_1st - out_2nd
55
56         else:
57             raise ValueError(f"order must be 'first' or 'second',
got {self.order}")
58
59         out = rearrange(out, 'b h n d -> b n (h d)')
60         return self.to_out(out)

```

Listing 1: la atencion