

A Pseudo Code for Data Generation

Algorithm 1: Generate Data Samples

Input: Raw interactions, data sample templates for recommendation and auxiliary tasks,
 $\text{data_split} \in \{\text{Train}, \text{Valid}, \text{Test}\}$, window size w , candidate pool size c

Output: Data samples \mathcal{D}

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1  $\mathcal{I} \leftarrow$  a set of unique items (shuffled and mapped to
  short IDs)
2  $\mathcal{S} \leftarrow$  a list of chronologically ordered user purchase
  sequences
3  $\mathcal{D} \leftarrow \{\}$ 
4 for  $s \in \mathcal{S}$  do
5   if  $\text{data\_split} = \text{Train}$  then
6      $s_{\text{sub}} \leftarrow$  all subsequences of the training split
      of  $s$ , each is of length up to  $w$ 
7   if  $\text{data\_split} = \text{Valid}$  then
8      $s_{\text{sub}} \leftarrow$  a subsequence of  $s$  that ends with the
      validation item, proceeding items beyond  $w$ 
      are truncated
9   if  $\text{data\_split} = \text{Test}$  then
10     $s_{\text{sub}} \leftarrow$  a subsequence of  $s$  that ends with the
      test item, proceeding items beyond  $w$  are
      truncated
11   for  $ss \in s_{\text{sub}}$  do
12     for  $\text{task} \in \{\text{Retrieval}, \text{Ranking}, \text{Rating}$ 
       $\text{prediction}\}$  do
13       if  $\text{task} = \text{Ranking}$  then
14          $neg \leftarrow$  sample  $c - 1$  negative items
          from  $\mathcal{I} \setminus s$ 
15         Generate a data sample  $d$  with  $ss$ , task
          template, and  $neg$  (for Ranking only)
16         Add  $d$  to  $\mathcal{D}$ 
17       if  $\text{data\_split} = \text{Train}$  then
18         for  $\text{task} \in \{\text{MIM}, \text{MLM}, \text{BPR}\}$  do
19           if  $\text{task} = \text{BPR}$  then
20              $neg \leftarrow$  sample 1 negative item
              from  $\mathcal{I} \setminus s$ 
21             Generate a data sample  $d$  with  $ss$ , task
              template, and  $neg$  (for BPR only)
22             Add  $d$  to  $\mathcal{D}$ 
23 return  $\mathcal{D}$ 

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