
```

1 import torch
2 import torch.nn as nn
3
4 '''
5
6 Ensemble model, currently composed of a GNN model and a Transformer model.
7 Combines embeddings from both with a small MLP,
8 which projects back to the original embedding dimension.
9
10 '''
11
12 class EnsembleEmbedder(nn.Module):
13     def __init__(self,
14         gnn_model,
15         transformer_model,
16         d_model,
17         global_pool='max',
18         dropout=0):
19
20         super(EnsembleEmbedder, self).__init__()
21
22         self.gnn_model = gnn_model
23         self.transformer_model = transformer_model
24
25         self.reduce_proj = nn.Sequential(nn.Dropout(dropout),
26                                           nn.Linear(d_model * 2, d_model),
27                                           nn.ReLU())
28
29         self.global_pool = global_pool
30
31     def forward(self, data):
32         # assume data is passed as a tuple, (graph, sequence)
33
34         out = torch.cat([self.gnn_model(data[0]),
35                         self.transformer_model(data[1])], dim=1)
36
37         out = self.reduce_proj(out)
38
39         return out
40

```

Listing 1: Adding new model specification to models module

```

1  ...
2  from models.ensemble.ensemble import EnsembleEmbedder
3
4  def get_model(model_config):
5      if model_config.model_type == 'transformer':
6          ...
7      elif model_config.model_type == 'gcn':
8          ...
9
10     ##### Additional code #####
11
12
13     elif model_config.model_type == 'ensemble':
14
15         model_0 = FormulaNetEdges(
16             input_shape=model_config.model_attributes['vocab_size'],
17             embedding_dim=model_config.model_attributes['embedding_dim'],
18             num_iterations=model_config.model_attributes['gnn_layers'],
19             batch_norm=model_config.model_attributes['batch_norm']
20             if 'batch_norm' in model_config.model_attributes else True)
21
22         model_1 = TransformerWrapper(
23             ntoken=model_config.model_attributes['vocab_size'],
24             d_model=model_config.model_attributes['embedding_dim'],
25             nhead=model_config.model_attributes['num_heads'],
26             nlayers=model_config.model_attributes['num_layers'],
27             dropout=model_config.model_attributes['dropout'],
28             d_hid=model_config.model_attributes['dim_feedforward'],
29             small_inner=model_config.model_attributes['small_inner']
30             if 'small_inner' in model_config.model_attributes else False,
31             max_len=model_config.model_attributes['max_len']
32             if 'max_len' in model_config.model_attributes else 512)
33
34         return EnsembleEmbedder(
35             d_model=model_config.model_attributes['embedding_dim'],
36             gnn_model=model_0,
37             transformer_model=model_1,
38             dropout=model_config.model_attributes['dropout'])
39
40     #####
41

```

Listing 2: Adding new model to get_model interface

```

1  ...
2
3  ##### Additional code #####
4
5  # return list of tuples,
6  # with graph and sequence data in first/second positions
7  model_config
8  def to_ensemble_batch(data_list, attributes):
9      data_list_0 = [a[0] for a in data_list]
10     data_list_1 = [a[1] for a in data_list]
11     data_list_0 = to_graph_batch(data_list_0, attributes)
12     data_list_1 = to_sequence_batch(data_list_1, attributes['max_len'])
13     data_list_1 = (data_list_1[0], data_list_1[1])
14     return (data_list_0, data_list_1)
15
16  #####
17
18  ...
19
20  def transform_batch(batch, config):
21      if config.type == 'graph':
22          return to_graph_batch(batch, config.attributes)
23      elif config.type == 'sequence':
24          return to_sequence_batch(batch, config.attributes['max_len'])
25      elif config.type == 'relation':
26          return list_to_relation(batch, config.attributes['max_len'])
27      elif config.type == 'fixed':
28          return batch
29
30  ##### Additional code #####
31
32      elif config.type == 'ensemble':
33          return to_ensemble_batch(batch, config.attributes)
34
35  #####
36

```

Listing 3: Adding necessary transforms for new data type

```
1
2 data_config:
3   type: 'ensemble'
4   data_options:
5     filter: ['tokens', 'edge_attr', 'edge_index', 'sequence']
6   attributes:
7     max_len: 1024
8
```

Listing 4: Configuration specifying new data type and fields it needs from database

```
1 # @package _global_
2 defaults:
3   - holist_supervised
4   - /data_type/ensemble@here_
5
6 exp_config:
7   name: ensemble_holist_supervised
8
9 model_config:
10  model_type: ensemble
11  model_attributes:
12    embedding_dim: 128
13    gnn_layers: 12
14    batch_norm: False
15    dropout: 0.2
16    num_layers: 4
17    num_heads: 4
18    dim_feedforward: 256
```

Listing 5: Configuration using the model in an example experiment