PEG-PYG Description

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The PEG layer from the "Equivariant and Stable Positional Encoding for More Powerful Graph Neural Networks"

The PEG layer:

$$X^{'},Z^{'}=(\sigma[(\hat{A}\odot M)XW],Z)$$

where $M_{uv} = MLP(||Z_u - Z_v||), \forall u, v \in V$. $\hat{A} = \hat{D}^{-1/2}(A+I)\hat{D}^{-1/2}$ is the normalized adjacent matrix and $\hat{D}_{ii} = \Sigma_{j=0}\hat{A}_{ij}$ is diagonal degree matrix. \odot denotes Hadamard product and Z is the positional encoding. The adjacency matrix can include other values than 1 representing edge weights via the optional edge_weight tensor.

PARAMETERS:

- in_feats_dim: (int) Size of each input node feature sample
- pos_dim: (int) Size of each input positional encoding sample. Notice in PEG we do not update the positional encodings.
- out_feats_dim: (int) Size of each output node embedding sample.
- edge_mlp_dim: (int) We use MLP to make one to one mapping between the relative information and edge weight. edge_mlp_dim represents the hidden units dimension in the MLP. (default: 32)
- improved: (bool, optional) If set to :obj: 'True', the layer computes \hat{A} ' as A + 2I. (default: 'False')
- cached: (bool, optional) If set to: True, the layer will cache the computation of $\hat{D}^{-1/2}\hat{A}\hat{D}^{-1/2}$ on first execution, and will use the cached version for further executions. This parameter should only be set to: 'True' in transductive learning scenarios. (default: 'False')
- add_self_loops: (bool, optional) If set to: 'False', will not add self-loops to the input graph. (default: 'True')
- normalize: (bool, optional) Whether to add self-loops and compute symmetric normalization coefficients on the fly. (default: 'True')

- bias: (bool, optional) If set to: 'False', the layer will not learn an additive bias. (default: 'True')
- **update_coors:** (bool, optional) Whether to update positional encodings. (default: 'False')
- use_formerinfo: (bool, false) Whether to use previous layer's output to update node features. (default: 'False')
- norm_coors: Whether to normalize positional encodings. Only used when update_coors = True. (default: 'False')
- **kwargs: (optional) Additional arguments of: class: 'torch_geometric.nn.conv.MessagePassing'.

SHAPES

- input: node features :($|\mathcal{V}|$, F_{in}), positional encodings: ($|\mathcal{V}|$, P_{in}), edge indices: $(2,|\mathcal{E}|)$, edge weights: ($|\mathcal{E}|$) (optional)
- output: node features: ($|\mathcal{V}|$, F_{out}), positional encodings: ($|\mathcal{V}|$, P_{out}) reset_parameters()

forward(x: torch.Tensor, edge_index: Union[torch.Tensor, torch_sparse.tensor.SparseTensor], edge_weight: Optional[torch.Tensor] = None) \rightarrow torch.Tensor